Intro to R

Part 2: Functions and Objects

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Agenda

- 1. Recap of last lecture
 - Using packages: install.packages() & require()
 - Loading and manipulating data: read_rds() and %>%
- 2. tidyverse functions
 - filter and select
 - summarize and mutate
 - o group_by

Loading Packages & Data

- Create an .Rmd file and save to your code folder
 - Accept defaults, Save As... (with a good name), then knit
- Load the tidyverse package

```
require(tidyverse)
```

- Load the data from the course github page directly using read_rds()
 - We create an "object" to store the data using a left-arrow: <-

```
df<-
read_rds("https://github.com/jbisbee1/DS1000_F2024/raw/main/data/sc_deb</pre>
```

Tabular Data

- Data comes in many different formats
- Structured data: standardized, well-defined structure, easily accessed
 - I.e., tables, databases
 - In my YouTube example, the survey we gave was structured
- Unstructured data: messy, organic, disorganized, hard to use
 - I.e., web pages, images, videos
 - In my YouTube example, the scraped HTML code of a list of recommendations was unstructured
- In this class, we will always be working with structured data...specifically "tabular data frames"
- This still requires work to prepare!

Tabular Data Frame

- AKA a "tibble"
- These are "square" (although actually rectagular)
- Rows: units of observation (i.e., the entities we are studying)
 - People (each row is a survey respondent, athlete, etc.)
 - Places (each row is a state, county, country, etc.)
 - Things (each row is a tweet, firm, product, etc.)
- Columns: variables of interest (i.e., attributes we are studying)
 - Beliefs / behaviors / etc. (i.e., where rows are people)
 - Rainfall / crimes / etc. (i.e., where rows are places)
 - Likes / profits / etc. (i.e., where rows are things)

Looking at Data

- We now have the contents of sc_debt.Rds stored in the object df
- We can look at this object directly

df

```
## # A tibble: 2,546 × 16
      unitid instmm stabbr grad debt mdn control region preddeg
##
##
       <int> <chr> <chr>
                                     <int> <chr> <chr> <chr>
                                     33375 Public South... Bachel...
   1 100654 Alaba... AL
##
##
   2 100663 Unive... AL
                                    22500 Public South... Bachel...
                                    27334 Private South... Associ...
   3 100690 Amrid... AL
##
##
   4 100706 Unive... AL
                                    21607 Public South... Bachel...
                                    32000 Public South... Bachel...
## 5 100724 Alaba... AL
##
   6 100751 The U... AL
                                  23250 Public South... Bachel...
##
   7 100760 Centr... AL
                                    12500 Public South... Associ...
## 8 100812 Athen... AL
                                  19500 Public South... Bachel...
##
   9 100830 Aubur... AL
                                   24826 Public South... Bachel...
  10 100858 Aubur... AL
                                     21281 Public South... Bachel...
  # i 2,536 more rows
## # i 9 more variables: openadmp <int>, adm rate <dbl>,
       ccbasic <int>, sat avg <int>, md earn wne p6 <int>,
## #
```

Looking at Data

- What is our unit of observation?
 - Academic institutions: each row is a single school
- What are our variables of interest?
 - Let's look!

```
colnames(df) # Prints the variable names
```

```
"stabbr"
        "unitid"
                          "instnm"
##
##
    [4] "grad debt mdn"
                          "control"
                                            "region"
    [7] "preddeg"
                          "openadmp"
                                            "adm rate"
##
   [10] "ccbasic"
                          "sat avg"
                                            "md earn wne p6"
                                            "selective"
   [13] "ugds"
                          "costt4 a"
##
## [16] "research u"
```

Good Data has Codebooks!

Name	Definition
unitid	Unit ID
instnm	Institution Name
stabbr	State Abbreviation
grad_debt_mdn	Median Debt of Graduates
control	Control Public or Private
region	Census Region
preddeg	Predominant Degree Offered: Assocates or Bachelors
openadmp	Open Admissions Policy: 1=Yes, 2=No, 3=No 1st time students
adm_rate	Admissions Rate: proportion of applications accepted
ccbasic	Type of institution*
sat_avg	Average SAT scores
md_earn_wne_p6	Average Earnings of Recent Graduates
ugds	Number of undergraduates
costt4_a	Average cost of attendance (tuition-grants)
selective	Institution admits fewer than 10% of applications, 1=Yes, 0=No
research_u	Institution is a research university, 1=Yes, 0=No

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Looking at data

Looking at data is crucial

```
# First 6 rows
df %>% head()
```

```
## # A tibble: 6 x 16
  unitid instnm stabbr grad debt mdn control region preddeg
    <int> <chr> <chr>
                             <int> <chr> <chr> <chr>
##
  1 100654 Alabam... AL
                                 33375 Public South... Bachel...
  2 100663 Univer... AL
                                22500 Public South... Bachel...
                                27334 Private South... Associ...
  3 100690 Amridg... AL
  4 100706 Univer... AL
                                21607 Public South... Bachel...
                                32000 Public South... Bachel...
  5 100724 Alaham. Al
                                23250 Public South... Bachel...
  6 100751 The Un... AL
## # i 9 more variables: openadmp <int>, adm_rate <dbl>,
      ccbasic <int>, sat avg <int>, md earn wne p6 <int>,
## #
## #
    ugds <int>, costt4 a <int>, selective <dbl>,
## #
      research u <dbl>
```

(Same as head(df))

Looking at data

Looking at data is crucial

```
# Last 6 rows
df %>% tail()
```

```
## # A tibble: 6 x 16
   unitid instnm stabbr grad debt mdn control region preddeg
    <int> <chr> <chr>
                            <int> <chr>      <chr>      <chr>
##
  1 493716 Yeshiv... NJ
                                       NA Private North... Associ...
                                       NA Public South... Bachel...
  2 493725 Univer... AR
  3 493822 Colleg... RI
                                       NA Private New E... Bachel...
  4 494630 Christ... TX
                                       NA Private South... Bachel...
  5 494685 Urshan... MO
                                       NA Private Plains Bachel...
  6 494737 Yeshiv... NY
                                       NA Private North... Bachel...
## # i 9 more variables: openadmp <int>, adm_rate <dbl>,
## #
       ccbasic <int>, sat avg <int>, md earn wne p6 <int>,
## #
    ugds <int>, costt4 a <int>, selective <dbl>,
## #
      research u <dbl>
```

(Same as tail(df))

- Last lecture, we wanted to know...
 - 1. Where is Vanderbilt University?

```
df %>%
  filter(instnm == "Vanderbilt University") # Only select rows with
Vandy
```

- What if we don't know precisely how Vandy is spelled in these data?
- str_detect() and grepl() to the rescue!

```
df %>%
  filter(str_detect(instnm,'Vand'))
```

- What if we don't know precisely how Vandy is spelled in these data?
- str_detect() and grepl() to the rescue!

```
df %>%
  filter(grepl('Vand',instnm))
```

- We can go deeper with this logic
 - "or" denoted with
 - "and" denoted with &

```
df %>%
  filter(str_detect(instnm, "Vand") | str_detect(instnm, "Tenn"))
```

```
# A tibble: 12 × 16
##
      unitid instmm stabbr grad debt mdn control region preddeg
       <int> <chr> <chr>
                                      <int> <chr> <chr> <chr>
##
    1 149639 Vande... IL
##
                                      27000 Private Great... Bachel...
##
   2 220075 East ... TN
                                      20500 Public South... Bachel...
##
    3 220978 Middl... TN
                                      21500 Public South... Bachel...
##
    4 221485 South... TN
                                         NA Public South... Associ...
   5 221731 Tenne... TN
                                      21500 Private South... Bachel...
##
                                      20635 Public South... Bachel...
    6 221740 The U... TN
##
##
    7 221759 The U... TN
                                      20500 Public South... Bachel...
    8 221768 The U... TN
                                      22500 Public
                                                     South... Bachel...
##
    9 221838 Tenne... TN
                                                     South... Bachel...
##
                                      27000 Public
## 10 221847 Tenne... TN
                                      17000 Public
                                                      South... Bachel...
```

- We can go deeper with this logic
 - "or" denoted with
 - "and" denoted with &

```
df %>%
  filter(str_detect(instnm, "Vand") & str_detect(instnm, "Univ"))
```

Can also put | or & in a single str_detect()

```
df %>%
  filter(str_detect(instnm, 'Vand|Tenn'))
```

```
## # A tibble: 12 × 16
      unitid instnm stabbr grad_debt_mdn control region preddeg
##
       <int> <chr> <chr>
                                     <int> <chr> <chr> <chr>
##
    1 149639 Vande... IL
                                     27000 Private Great... Bachel...
##
    2 220075 East ... TN
                                     20500 Public South... Bachel...
##
   3 220978 Middl... TN
                                     21500 Public South... Bachel...
##
    4 221485 South... TN
                                         NA Public South... Associ...
##
##
   5 221731 Tenne... TN
                                     21500 Private South... Bachel...
##
   6 221740 The U... TN
                                     20635 Public South... Bachel...
##
  7 221759 The U... TN
                                     20500 Public South... Bachel...
##
    8 221768 The U... TN
                                     22500 Public South... Bachel...
##
    9 221838 Tenne... TN
                                     27000 Public South... Bachel...
   10 221847 Tenne... TN
                                     17000 Public South... Bachel...
                                  14962 Private South... Bachel...
   11 221999 Vande... TN
   12 487010 The U... TN
                                     13500 Public South... Bachel...
  # i 9 more variables: openadmp <int>, adm rate <dbl>,
       ccbasic <int>, sat avg <int>, md earn wne p6 <int>,
## #
```

But can't do the same with &

```
df %>%
  filter(str_detect(instnm,'Vand&Univ'))
```

```
## # A tibble: 0 x 16
## # i 16 variables: unitid <int>, instnm <chr>, stabbr <chr>,
## # grad_debt_mdn <int>, control <chr>, region <chr>,
## # preddeg <chr>, openadmp <int>, adm_rate <dbl>,
## # ccbasic <int>, sat_avg <int>, md_earn_wne_p6 <int>,
## # ugds <int>, costt4_a <int>, selective <dbl>,
## # research_u <dbl>
```

- Negations are handled with!
 - Literally means "not"
- Drop rows with "of" in the school name

```
df %>%
  filter(!str_detect(instnm,"of"))
```

```
## # A tibble: 2,025 × 16
##
      unitid instnm stabbr grad debt mdn control region preddeg
       <int> <chr> <chr>
                                      <int> <chr> <chr> <chr>
##
                                      33375 Public South... Bachel...
##
    1 100654 Alaba... AL
##
   2 100690 Amrid... AL
                                      27334 Private South... Associ...
                                      32000 Public South... Bachel...
##
    3 100724 Alaba... AL
##
    4 100760 Centr... AL
                                      12500 Public South... Associ...
   5 100812 Athen... AL
                                      19500 Public South... Bachel...
##
##
    6 100830 Aubur... AL
                                      24826 Public South... Bachel...
    7 100858 Aubur... AL
##
                                      21281 Public South... Bachel...
    8 100937 Birmi... AL
                                      25773 Private South... Bachel...
##
    9 101028 Chatt... AL
                                      11931 Public South... Associ...
##
## 10 101161 Coast... AL
                                      11000 Public
                                                      South... Associ..
```

• (same as...)

```
df %>%
  filter(!grepl("of",instnm))
```

```
## # A tibble: 2,025 × 16
     unitid instnm stabbr grad debt mdn control region preddeg
##
       <int> <chr> <chr>
                                     <int> <chr> <chr> <chr>
##
   1 100654 Alaba... AL
                                    33375 Public South... Bachel...
##
   2 100690 Amrid... AL
                                    27334 Private South... Associ...
##
## 3 100724 Alaba... AL
                                    32000 Public South... Bachel...
   4 100760 Centr... AL
                                    12500 Public South... Associ...
##
## 5 100812 Athen... AL
                                    19500 Public South... Bachel...
## 6 100830 Aubur... AL
                                    24826 Public South... Bachel...
## 7 100858 Aubur... AL
                                    21281 Public South... Bachel...
##
   8 100937 Birmi... AL
                                    25773 Private South... Bachel...
##
    9 101028 Chatt... AL
                                    11931 Public South... Associ...
   10 101161 Coast... AL
                                    11000 Public South... Associ...
  # i 2,015 more rows
  # i 9 more variables: openadmp <int>, adm rate <dbl>,
       ccbasic <int>, sat avg <int>, md earn wne p6 <int>,
       ugds <int>, costt4 a <int>, selective <dbl>,
```

Manipulating: select()

- Still TMI!
- Before, I only cared about the admissions rate (adm_rate), the SAT scores (sat_avg), and the future earnings (md_earn_wne_p6)
- select will select columns

```
df %>%
  filter(instnm == "Vanderbilt University") %>%
  select(instnm,adm_rate,sat_avg,md_earn_wne_p6) # Select variables
  of interest
```

Manipulating: select()

 We can use matches() function with select() in a manner similar to str_detect()

```
df %>%
  select(matches("_"))
```

```
## # A tibble: 2,546 × 6
      grad debt mdn adm rate sat avg md earn wne p6 costt4 a
##
##
              <int>
                       <dbl>
                                <int>
                                               <int>
                                                        <int>
##
              33375 0.918
                                  939
                                               25200
                                                        23053
##
              22500
                    0.737
                                                        24495
                                1234
                                               35100
##
              27334
                    NA
                                  NΑ
                                               30700
                                                        14800
##
              21607
                    0.826 \overline{1319}
                                                        23917
                                               36200
##
              32000
                    0.969
                                946
                                               22600
                                                        21866
##
              23250
                       0.827
                                                        29872
                                1261
                                               37400
##
              12500
                                  NΑ
                                               23100
                                                        10493
                      NA
##
              19500
                      NA
                                  NA
                                               33400
                                                           NA
##
              24826
                      0.904
                                1082
                                               30100
                                                        19849
##
              21281
                       0.807
                                1300
                                               39500
                                                        31590
## # i 2,536 more rows
  # i 1 more variable: research u <dbl>
```

Stepping back

- RQ: How might admissions and SAT scores be related?
 - Theory: selective schools have stricter criteria
 - Hypothesis: admissions and SAT scores should be negatively related
- How can we test this hypothesis?

Summarizing Data: summarise() + mean()

• We can combine base R functions with tidyverse functions!

```
Base R: mean()tidyverse: summarise() (aka summarize())
```

Overall average SAT scores

```
df %>%
  summarise(mean_sat = mean(sat_avg,na.rm=T)) # Average SAT scores
for entire data
```

```
## # A tibble: 1 × 1
## mean_sat
## <dbl>
## 1 1141.
```

Summarizing Data

• Let's unpack this

```
df %>%
  summarise(mean_sat = mean(sat_avg,na.rm=T))
```

- Create new variable mean_sat that contains the mean() of every school's average SAT score
- na.rm=T means we want to ignore missing data. If not?

```
df %>%
  summarise(mean_sat = mean(sat_avg))
```

```
## # A tibble: 1 × 1
## mean_sat
## <dbl>
## 1 NA
```

Summarizing Data

Recall we want see if more selective schools have higher SAT scores

```
df %>%
  filter(adm_rate < .1) %>% # Only schools who accept < 10%
  summarise(mean_sat_LT10 = mean(sat_avg,na.rm=T)) # Average SAT</pre>
```

```
## # A tibble: 1 × 1
## mean_sat_LT10
## <dbl>
## 1 1510.
```

```
df %>%
  filter(adm_rate > .1) %>% # Only schools who accept > 10%
  summarise(mean_sat_GT20 = mean(sat_avg,na.rm=T)) # Average SAT
```

Adding / changing variables: mutate()

mutate() creates a new variable

```
df %>%
  mutate(newvar = 1) %>%
  select(instnm,newvar)
```

```
## # A tibble: 2,546 × 2
##
     instnm
                                          newvar
   <chr>
                                          <dbl>
  1 Alabama A & M University
##
   2 University of Alabama at Birmingham
##
   3 Amridge University
  4 University of Alabama in Huntsville
##
## 5 Alabama State University
##
  6 The University of Alabama
## 7 Central Alabama Community College
## 8 Athens State University
   9 Auburn University at Montgomery
##
  10 Auburn University
```

Object Assignment Operator: < -

- Thus far, nothing we have done has changed df
- Use object assignment operator < to **overwrite** an existing object

```
df <- df %>%
  mutate(adm_rate_pct = adm_rate*100)
```

Did it work?

```
df %>%
  summarise(adm_rate_pct = mean(adm_rate_pct,na.rm=T),
        adm_rate = mean(adm_rate,na.rm=T))
```

- 3 inputs:
 - Logical statement (labeled test)
 - Value if the logic is TRUE (labeled yes)
 - Value if the logic is FALSE (labeled no)
- ifelse([LOGIC],[VALUE IF TRUE],[VALUE IF FALSE])

 Say it out loud: "Create a new variable called sel that records if the school is selective or not. If the admissions rate is less than 10% (0.1), record the school as sel = 1. Otherwise, record the school as sel = 0."

Say it out loud: "Create a new variable called sel that records if the school is selective or not. If the admissions rate is less than 10% (0.1), record the school as sel = 1. Otherwise, record the school as sel = 0."

Say it out loud: "Create a new variable called sel that records if the school is selective or not. If the admissions rate is less than 10% (0.1),
 record the school as sel = 1. Otherwise, record the school as sel = 0."

Say it out loud: "Create a new variable called sel that records if the school is selective or not. If the admissions rate is less than 10% (0.1), record the school as sel = 1. Otherwise, record the school as sel = 0."

Logic: ifelse() + mutate()

 Remember that if we want to keep this, we need the assignment operator < -

Summarizing Data: group_by()

- One final tidyverse function: group_by()
- Let's use the newly created selective variable which is either 1 or 0

```
df %>%
  select(instnm, selective, adm_rate)
```

```
## # A tibble: 2,546 × 3
##
     instnm
                                         selective adm rate
   <chr>
                                             <dbl> <dbl>
##
   1 Alabama A & M University
                                                     0.918
   2 University of Alabama at Birmingham
##
                                                0 0.737
##
   3 Amridge University
                                                NA NA
##
   4 University of Alabama in Huntsville
                                                   0.826
##
   5 Alabama State University
                                                0 0.969
##
   6 The University of Alabama
                                                0 0.827
  7 Central Alabama Community College
##
                                                NA
                                                    NΑ
## 8 Athens State University
                                                NA
                                                    NA
##
   9 Auburn University at Montgomery
                                                    0.904
  10 Auburn University
                                                     0.807
  # i 2,536 more rows
```

Summarizing Data: group_by()

Instead of running two separate filter() commands, use group by()

```
df %>%
  # Group the data by selective (either 1 or 0)
  group_by(selective) %>%
  # Calculate average SAT for each group
  summarise(mean_sat = mean(sat_avg,na.rm=T))
```

```
## # A tibble: 3 × 2
## selective mean_sat
## 1 0 1135.
## 2 1 1510.
## 3 NA NaN
```

Results

- Do more selective schools have higher SAT scores?
- Yes
- This Result confirms our Hypothesis and answers our Research Question

Conclusion

- What we've done today is a microcosm of data science
 - 1. Opened data (readRDS)
 - 2. Looked at data (tidyverse + select(), filter(), arrange())
 - 3. Generated hypotheses (Admissions versus SAT scores)
 - 4. Tested hypotheses (summarise() + mean())

Advanced Logic: filter()

If no time, jump to end

```
filter() command with other logical operators
>, <: greater than, less than (>=, <=)</li>
!: not (i.e., != means "not equal to")
&: and
|: or
```

```
df %>%
  # Schools EXCEPT Vandy
  filter(instnm != "Vanderbilt University") %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 2,545 × 4
      instnm
                                          stabbr adm rate sat avg
##
                                          <chr>>
                                                    <dbl>
##
      <chr>>
                                                             <int>
##
   1 Alabama A & M University
                                          AL
                                                    0.918
                                                               939
    2 University of Alabama at Birming... AL
##
                                                    0.737
                                                              1234
##
   3 Amridge University
                                                   NA
                                                                NA
                                          AL
    4 University of Alabama in Huntsvi... AL
##
                                                    0.826
                                                              1319
    5 Alabama State University
##
                                          AL
                                                    0.969
                                                               946
```

Advanced Logic: str_detect()

• filter() command with other functions

```
str_detect([VAR],[PATTERN]): detect a stringgrep1([PATTERN],[VAR]): also detects a string
```

```
df %>%
  filter(str_detect(instnm,"Vanderbilt")) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

Advanced Logic: str_detect()

String detection is case sensitive!

```
df %>%
  filter(str_detect(instnm,"VAND")) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 0 × 4
## # i 4 variables: instnm <chr>, stabbr <chr>,
## # adm_rate <dbl>, sat_avg <int>
```

```
df %>%
  filter(str_detect(instnm, "anderbil")) %>%
  select(instnm, stabbr, adm_rate, sat_avg)
```

```
df %>%
  filter(str_detect(instnm, "Colorado")) %>%
  select(instnm, stabbr, adm_rate, sat_avg)
```

```
## # A tibble: 12 × 4
##
      instnm
                                         stabbr adm rate sat avg
      <chr>>
                                                    <dhl>
                                                            <int>
##
                                         <chr>>
    1 University of Colorado Denver/An... CO
                                                    0.673
                                                             1124
##
   2 University of Colorado Colorado ...
                                         CO
                                                    0.872
                                                             1136
   3 University of Colorado Boulder
##
                                         CO
                                                    0.784
                                                             1276
##
   4 Colorado Christian University
                                         CO
                                                   NΑ
                                                               NA
##
   5 Colorado College
                                         CO
                                                    0.135
                                                               NΑ
##
   6 Colorado School of Mines
                                         CO
                                                    0.531
                                                             1342
##
   7 Colorado State University-Fort C... CO
                                                    0.814
                                                             1204
##
   8 Colorado Mesa University
                                         CO
                                                    0.782
                                                             1063
                                         CO
    9 University of Northern Colorado
                                                    0.908
                                                             1096
##
  10 Colorado State University Pueblo
                                         CO
                                                    0.930
                                                             1047
  11 Western Colorado University
                                         CO
                                                    0.842
                                                             1114
  12 Colorado State University-Global... CO
                                                    0.986
                                                             1048
```

```
df %>%
  filter(grepl("Colorado",instnm) & grepl(' of ',instnm)) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 5 \times 4
##
    instnm
                                        stabbr adm rate sat avg
                                                  <dbl>
                                                         <int>
##
    <chr>>
                                        <chr>
## 1 University of Colorado Denver/Ans... CO
                                                  0.673
                                                           1124
  2 University of Colorado Colorado S... CO
                                                  0.872
                                                          1136
## 3 University of Colorado Boulder
                                        CO
                                                  0.784 1276
## 4 Colorado School of Mines
                                        CO
                                                  0.531
                                                          1342
## 5 University of Northern Colorado
                                        CO
                                                  0.908
                                                           1096
```

```
df %>%
  filter(grepl("Colorado",instnm) | grepl('Vermont',instnm)) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 16 x 4
##
      instnm
                                         stabbr adm rate sat avg
      <chr>>
                                                    <dbl>
                                                            <int>
##
                                         <chr>>
##
   1 University of Colorado Denver/An... CO
                                                    0.673
                                                             1124
##
   2 University of Colorado Colorado ... CO
                                                    0.872
                                                             1136
   3 University of Colorado Boulder
##
                                         CO
                                                    0.784
                                                             1276
##
   4 Colorado Christian University
                                         CO
                                                  NA
                                                               NA
   5 Colorado College
##
                                         CO
                                                    0.135
                                                               NΑ
##
   6 Colorado School of Mines
                                         CO
                                                    0.531
                                                             1342
##
   7 Colorado State University-Fort C... CO
                                                    0.814
                                                             1204
##
   8 Colorado Mesa University
                                                             1063
                                         CO
                                                    0.782
    9 University of Northern Colorado
##
                                         CO
                                                    0.908
                                                             1096
  10 Colorado State University Pueblo
                                                             1047
                                         CO
                                                    0.930
  11 Western Colorado University
                                         CO
                                                   0.842
                                                             1114
  12 Community College of Vermont
                                         VT
                                                  NA
                                                               NA
  13 Northern Vermont University
                                         VT
                                                    0.778
                                                               NA
  14 Vermont Technical College
                                                    0.670
                                         VT
                                                               NA
                                                    0.673
## 15 University of Vermont
                                         VT
                                                             1287
```

```
df %>%
  filter((grepl("Colorado",instnm) | grepl('Vermont',instnm)) &
grepl(' of ',instnm)) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 7 × 4
   instnm
##
                                       stabbr adm rate sat avg
                                                         <int>
##
    <chr>>
                                       <chr>
                                                 <dbl>
  1 University of Colorado Denver/Ans... CO
                                                 0.673
                                                          1124
  2 University of Colorado Colorado S... CO
                                                 0.872 1136
  3 University of Colorado Boulder
                                       CO
                                                 0.784
                                                          1276
## 4 Colorado School of Mines
                                       CO
                                                 0.531
                                                          1342
  5 University of Northern Colorado
                                       CO
                                                 0.908
                                                          1096
  6 Community College of Vermont
                                       VT
                                                NΑ
                                                            NΑ
  7 University of Vermont
                                       VT
                                                 0.673
                                                          1287
```

• & can be separated into multiple filter() commands

```
df %>%
  filter((grepl("Colorado",instnm) | grepl('Vermont',instnm))) %>%
  filter(grepl(' of ',instnm)) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 7 × 4
    instnm
                                        stabbr adm rate sat avg
##
##
    <chr>>
                                        <chr>>
                                                  <db1>
                                                          <int>
                                                           1124
## 1 University of Colorado Denver/Ans... CO
                                                  0.673
## 2 University of Colorado Colorado S... CO
                                                  0.872
                                                           1136
## 3 University of Colorado Boulder
                                        CO
                                                  0.784
                                                           1276
## 4 Colorado School of Mines
                                        CO
                                                  0.531
                                                          1342
## 5 University of Northern Colorado
                                        CO
                                                  0.908
                                                           1096
## 6 Community College of Vermont
                                        VT
                                                 NA
                                                           NA
## 7 University of Vermont
                                        VT
                                                  0.673
                                                           1287
```

can be moved into the str_detect() or grepl() commands

```
df %>%
  filter(grepl("Colorado|Vermont",instnm)) %>%
  filter(grepl(' of ',instnm)) %>%
  select(instnm,stabbr,adm_rate,sat_avg)
```

```
## # A tibble: 7 \times 4
    instnm
                                        stabbr adm rate sat avg
##
##
    <chr>>
                                         <chr>>
                                                   <db1>
                                                           <int>
                                                            1124
## 1 University of Colorado Denver/Ans... CO
                                                   0.673
  2 University of Colorado Colorado S... CO
                                                   0.872
                                                            1136
## 3 University of Colorado Boulder
                                         CO
                                                   0.784
                                                            1276
## 4 Colorado School of Mines
                                        CO
                                                   0.531
                                                           1342
## 5 University of Northern Colorado
                                        CO
                                                   0.908
                                                            1096
## 6 Community College of Vermont
                                        VT
                                                  NA
                                                            NA
## 7 University of Vermont
                                        VT
                                                   0.673
                                                            1287
```

Quick Test

• Filter schools from Texas with the word "community" in their name

INSERT CODE HERE

Advanced Logic: select()

 select can be paired with matches() or contains() for similar flexibility (equivalent to str_detect() or grepl() for filter())

```
df %>%
  select(contains('inst'))
```

```
## # A tibble: 2,546 × 1
     instnm
##
##
   <chr>
  1 Alabama A & M University
   2 University of Alabama at Birmingham
##
   3 Amridge University
##
   4 University of Alabama in Huntsville
##
## 5 Alabama State University
   6 The University of Alabama
##
  7 Central Alabama Community College
##
## 8 Athens State University
   9 Auburn University at Montgomery
  10 Auburn University
## # i 2,536 more rows
```

Advanced Logic: select()

matches can work with

```
df %>%
  select(!matches('_|inst'))
```

```
## # A tibble: 2,546 × 10
   unitid stabbr control region preddeg openadmp ccbasic
##
      <int> <chr>
                  <chr> <chr>
                                              <int> <int>
##
                                  <chr>
  1 100654 AL
                  Public Southeast Bachelo...
##
                                                        18
##
  2 100663 AL Public Southeast Bachelo...
                                                        15
##
  3 100690 AL Private Southeast Associa...
                                                        20
  4 100706 AL
                  Public Southeast Bachelo...
##
                                                        16
  5 100724 AL Public Southeast Bachelo...
##
                                                        19
  6 100751 AL Public Southeast Bachelo...
                                                        15
##
##
  7 100760 AL
                  Public Southeast Associa...
  8 100812 AL Public Southeast Bachelo...
##
                                                 NA
                                                        22
   9 100830 AL Public Southeast Bachelo...
                                                        18
  10 100858 AL Public Southeast Bachelo...
                                                        15
  # i 2,536 more rows
  # i 3 more variables: ugds <int>, selective <dbl>,
    sel <dbl>
## #
```

Advanced Logic: select()

select can also work with where to find classes

```
df %>%
  select(where(is.numeric))
```

```
## # A tibble: 2,546 × 13
     unitid grad debt mdn openadmp adm rate ccbasic sat avg
##
      <int>
                            <int>
##
                   <int>
                                    <dbl>
                                            <int>
                                                    <int>
   1 100654
                                    0.918
                                               18
                                                      939
##
                   33375
   2 100663
                   22500
                                2 0.737
                                               15
                                                     1234
##
  3 100690
                   27334
                                   NA
                                               20
##
                                                      NA
   4 100706
##
                   21607
                                   0.826
                                               16
                                                     1319
                                2 0.969
##
  5 100724
                   32000
                                               19
                                                      946
                                2 0.827
                                               15
##
  6 100751
                   23250
                                                     1261
##
  7 100760
                   12500
                                   NA
                                                      NA
##
   8 100812
                   19500
                               NA
                                   NA
                                               22
                                                      NA
##
   9 100830
                  24826
                                  0.904
                                               18
                                                     1082
##
  10 100858
                   21281
                                    0.807
                                               15
                                                     1300
  # i 2,536 more rows
  # i 7 more variables: md earn wne p6 <int>, ugds <int>,
      costt4 a <int>, selective <dbl>, research u <dbl>,
## #
      adm rate pct <dbl>, sel <dbl>
## #
```

Quick Test

• Filter to only schools in California and select only character columns

INSERT CODE HERE

Quiz & Homework

If time, jump to advanced

- Go to Brightspace and take the 2nd quiz
 - The password to take the quiz is ####

Homework:

- 1. Work through ds1000_hw_3.Rmd
- 2. Make sure to submit Pset 1 to Brightspace by Friday at midnight!