Lecture 14: Reshaping data

So far

- select: choose certain columns
- filter: choose certain rows
- summarize: calculate summary statistics
- group_by: group rows together
- mutate: create new columns
- count: count the number of rows
- arrange: re-order the rows
- across: apply functions across columns

Back to the dog data

```
1 sc_data <- cleaned_data |>
2 select(RID, GroupAssignment, sc_pre, sc_post)
3
4 sc_data

RID GroupAssignment sc_pre sc_post
1 1 Control 3.900000 3.800000
```

```
Direct 5.150000 5.263158
3
               Indirect 4.100000 4.150000
                Control 4.650000 5.100000
                 Direct 3.650000 3.600000
6
               Indirect 4.350000 4.650000
                Control 4.750000 4.400000
8
                 Direct 4.600000 4.650000
9
               Indirect 4.200000 4.150000
10
     10
                Control 5.800000 5.750000
11
    11
                 Direct 4.400000 4.800000
12
    12
               Indirect 4.100000 4.250000
13
     13
                Control 5.400000 5.600000
```

Question: What if we want to fit a model with this data?

Fitting a model

Want code that looks like this:

```
1 lm(score ~ GroupAssignment + stage, data = sc_data)
```

Problem: We don't have a column for stage! Or a column for score!

```
1 sc data >
    pivot longer(cols = c(sc pre, sc post),
 3
                 names to = "stage",
                 values to = "score")
 4
# A tibble: 568 × 4
    RID GroupAssignment stage
                              score
  <int> <chr>
                       <chr> <dbl>
                       sc_pre 3.9
      1 Control
      1 Control
                       sc post 3.8
                       sc_pre 5.15
   2 Direct
                       sc_post 5.26
    2 Direct
      3 Indirect
                       sc pre 4.1
      3 Indirect
                       sc post 4.15
                       sc_pre 4.65
   4 Control
    4 Control
                       sc post 5.1
      5 Direct
                       sc pre 3.65
      5 Direct
                       sc post 3.6
10
# i 558 more rows
```

id	bp1	bp2	
Α	100	120	
В	140	115	
С	120	125	



id	measurement	value
Α	bp1	100
Α	bp2	120
В	bp1	140
В	bp2	115
С	bp1	120
С	bp2	125

```
1 df |>
2  pivot_longer(
3   cols = bp1:bp2,
4   names_to = "measurement",
5   values_to = "value"
6  )
```

(Image from *R for Data Science*)

Another example:

```
# A tibble: 260 × 38
  Adult (15+) literacy rate ...¹ `1975` `1976` `1977` `1978` `1979`
`1980` `1981`
   <chr>
                                  <dbl> <dbl> <dbl> <dbl> <dbl>
<dbl> <dbl>
 1 Afghanistan
                                                   NA
                                                               4.99
                                     NA
                                            NA
                                                          NA
                                                                       NA
NA
 2 Albania
                                     NA
                                            NA
                                                   NA
                                                          NA NA
                                                                       NA
NA
3 Algeria
                                                   NA
                                     NA
                                            NA
                                                          NA
                                                              NA
                                                                       NA
NA
 4 Andorra
                                     NA
                                            NA
                                                   NA
                                                          NA NA
                                                                       NA
NA
 5 Angola
                                     NA
                                            NA
                                                   NA
                                                          NA NA
                                                                       NA
```

How might we want to restructure this data?

```
# A tibble: 260 × 38
  Adult (15+) literacy rate ... 1975 1976 1977 1978 1979
`1980` `1981`
  <chr>
                                <dbl> <dbl> <dbl> <dbl> <dbl>
<dbl> <dbl>
1 Afghanistan
                                   NA
                                          NA
                                                 NA
                                                        NA
                                                             4.99
                                                                    NA
NA
2 Albania
                                   NA
                                          NA
                                                 NA
                                                        NA NA
                                                                    NA
NA
3 Algeria
                                   NA
                                          NA
                                                 NA
                                                        NA NA
                                                                    NA
NA
4 Andorra
                                   NA
                                          NA
                                                 NA
                                                        NA NA
                                                                    NA
NA
5 Angola
                                   NA
                                          NA
                                                 NA
                                                        NA
                                                           NA
                                                                    NA
   litF |>
     rename(country = starts with("Adult")) |>
 2
   pivot longer(
       cols = -country,
 4
    names_to = ...,
      values to = ...
 6
```

```
litF |>
     rename(country = starts with("Adult")) |>
   pivot longer(
       cols = -country,
       names to = "year",
      values_to = "literacy_rate"
   ) |>
     drop na(literacy rate)
# A tibble: 571 × 3
  country year literacy rate
  <chr> <chr>
                            <dbl>
1 Afghanistan 1979
                           4.99
2 Afghanistan 2011
                            13
3 Albania
              2001
                           98.3
4 Albania 2008
                           94.7
5 Albania 2011
                           95.7
6 Algeria 1987
                           35.8
7 Algeria
              2002
                           60.1
8 Algeria
              2006
                           63.9
9 Angola
              2001
                           54.2
10 Angola
              2011
                            58.6
# i 561 more rows
```

```
litF |>
     rename(country = starts with("Adult")) |>
 2
     pivot longer(
       cols = -country,
       names to = "year",
       values to = "literacy rate",
       values drop na = T
 8
# A tibble: 571 × 3
  country year literacy rate
  <chr>
              <chr>
                            <dbl>
1 Afghanistan 1979
                            4.99
2 Afghanistan 2011
                            13
3 Albania
              2001
                            98.3
4 Albania 2008
                            94.7
5 Albania 2011
                            95.7
6 Algeria 1987
                            35.8
7 Algeria
              2002
                            60.1
8 Algeria
              2006
                            63.9
9 Angola
              2001
                            54.2
10 Angola
              2011
                            58.6
# i 561 more rows
```

Back to the dog data

```
sc data >
    pivot longer(cols = c(sc pre, sc post),
                names to = "stage",
                values to = "score")
 4
# A tibble: 568 \times 4
    RID GroupAssignment stage
                           score
  <int> <chr>
            <chr> <dbl>
     1 Control sc_pre 3.9
  1 Control
                     sc post 3.8
  2 Direct
                     sc pre 5.15
   2 Direct
                     sc post 5.26
  3 Indirect
                     sc pre 4.1
   3 Indirect
                     sc post 4.15
  4 Control
                     sc pre 4.65
     4 Control
                     sc post 5.1
     5 Direct
                     sc pre 3.65
10
     5 Direct
                     sc post 3.6
# i 558 more rows
```

Does the stage column only contain information about stage?

Back to the dog data

```
sc data >
     pivot longer(cols = c(sc pre, sc post),
 3
                  names to = c("measurement", "stage"),
                  names_sep = "_",
 4
                  values to = "score")
# A tibble: 568 × 5
    RID GroupAssignment measurement stage score
   <int> <chr>
                        <chr>
                                    <chr> <dbl>
      1 Control
                                    pre
                                           3.9
                        SC
      1 Control
                                    post 3.8
                        SC
      2 Direct
                                    pre 5.15
                        SC
      2 Direct
                                    post 5.26
                        SC
      3 Indirect
                                    pre 4.1
                        SC
      3 Indirect
                                    post
                                           4.15
                        SC
      4 Control
                                    pre
                                           4.65
                        SC
      4 Control
                                           5.1
                                    post
                        SC
      5 Direct
                                    pre 3.65
                        SC
10
      5 Direct
                                           3.6
                        SC
                                    post
# i 558 more rows
```

Working with all the measurements

```
cleaned data |>
     pivot longer(cols = -c(RID, GroupAssignment),
 3
                  names to = c("measurement", "stage"),
                  names_sep = "_",
 4
 5
                  values to = "score")
# A tibble: 4,544 × 5
    RID GroupAssignment measurement stage score
  <int> <chr>
                       <chr>
                                   <chr> <dbl>
      1 Control
                                   pre 3.2
                       pa
      1 Control
                                  post 3.8
                       рa
      1 Control
                       happiness
                                   pre 2.33
                       happiness
      1 Control
                                   post 3.33
                                   pre 3.9
      1 Control
                       SC
      1 Control
                                   post
                                         3.8
                       SC
      1 Control
                       fs
                                   pre
                                         6.12
      1 Control
                       fs
                                   post
                                         6
      1 Control
                       stress
                                   pre
10
      1 Control
                                         2
                       stress
                                   post
# i 4,534 more rows
```

Fitting a model

```
long data <- cleaned data |>
      pivot longer(cols = -c(RID, GroupAssignment),
 2
                   names_to = c("measurement", "stage"),
                   names_sep = "_",
 4
                   values to = "score")
    lm(score ~ GroupAssignment + stage, data = long data)
Call:
lm(formula = score ~ GroupAssignment + stage, data = long data)
Coefficients:
            (Intercept) GroupAssignmentDirect
GroupAssignmentIndirect
                3.16307
                                        -0.10118
-0.04836
               stagepre
                0.13805
```

But what if I want to fit a *separate* model for each well-being/ill-being measurement?

```
# A tibble: 4,544 \times 5
    RID GroupAssignment measurement stage score
   <int> <chr>
                         <chr>
                                     <chr> <dbl>
       1 Control
                                            3.2
                         pa
                                     pre
       1 Control
                                     post
                                            3.8
                         pa
       1 Control
                         happiness
                                     pre 2.33
       1 Control
                         happiness
                                     post 3.33
       1 Control
                                            3.9
                         SC
                                     pre
       1 Control
                                     post
                                            3.8
                         SC
       1 Control
                         fs
                                            6.12
                                     pre
       1 Control
                         fs
                                     post
                                            6
       1 Control
                         stress
                                     pre
10
       1 Control
                         stress
                                     post
# i 4,534 more rows
```

Perhaps we want to have a column for stage, and a column for each measurement?

```
1 cleaned data |>
     pivot longer(cols = -c(RID, GroupAssignment),
 3
                names to = c(".value", "stage"),
                names_sep = "_")
 4
# A tibble: 568 × 11
    RID GroupAssignment stage pa happiness sc
                                                 fs stress
homesick
                 <chr> <dbl> <dbl> <dbl> <dbl> <int>
  <int> <chr>
<int>
                                     2.33 3.9 6.12
1
      1 Control
                      pre
                             3.2
3
2
      1 Control
                             3.8
                                     3.33 3.8 6
                      post
3
3
      2 Direct
                                     3.33 5.15 5.25
                             3
                                                        2
                      pre
4
                             3.2 4 5.26 6
      2 Direct
                      post
2
      3 Indirect
                                     2.67 4.1 5.38
                             2.8
                      pre
```

pivot_wider

long data # A tibble: $4,544 \times 5$ RID GroupAssignment measurement stage score <int> <chr> <chr> <chr> <dbl> 1 Control 3.2 pre pa 1 Control 2 3.8 post pa 3 1 Control happiness 2.33 pre happiness 1 Control post 3.33 1 Control 3.9 SC pre 1 Control 3.8 post SC 1 Control 6.12 fs pre 1 Control fs post 6 1 Control stress pre 10 1 Control 2 stress post # i 4,534 more rows

pivot_wider

```
long data >
     pivot wider(id cols = c(RID, GroupAssignment, stage),
 3
                names from = measurement,
                values from = score)
 4
# A tibble: 568 × 11
    RID GroupAssignment stage pa happiness
                                                  fs stress
                                            SC
homesick
                  <chr> <dbl> <dbl> <dbl> <dbl> <dbl>
  <int> <chr>
<dbl>
                                     2.33 3.9 6.12
      1 Control
                      pre
                             3.2
                                                         2
3
2
      1 Control
                             3.8
                                     3.33 3.8 6
                      post
3
3
      2 Direct
                                     3.33 5.15 5.25
                             3
                                                         2
                      pre
4
      2 Direct
                             3.2
                                     4
                                          5.26 6
                      post
2
      3 Indirect
                                     2.67 4.1 5.38
                             2.8
                      pre
```

Class activity

https://sta279-

f23.github.io/class_activities/ca_lecture_14.html