

Lec 08 - `tidyverse`

Statistical Programming

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Reshaping data (Wide vs. Long)

Wide -> Long

The diagram illustrates the transformation of a wide data frame into a long data frame. On the left, a wide data frame is shown with columns for country (A, B, C) and years (1999, 2000). The values are 0.7K, 2K for country A in 1999 and 2000 respectively; 37K, 80K for country B; and 212K, 213K for country C. An arrow points from this wide frame to a long data frame on the right. The long data frame has columns for country, year, and cases. It contains six rows corresponding to the data in the wide frame, with the year column indicating the time period for each case value.

| country | 1999 | 2000 |
|---------|------|------|
| A | 0.7K | 2K |
| B | 37K | 80K |
| C | 212K | 213K |

→

| country | year | cases |
|---------|------|-------|
| A | 1999 | 0.7K |
| B | 1999 | 37K |
| C | 1999 | 212K |
| A | 2000 | 2K |
| B | 2000 | 80K |
| C | 2000 | 213K |

pivot_longer (previously gather)

Syntax

```
(d = tibble::tribble(  
  ~country, ~"1999", ~"2000",  
    "A", "0.7K", "2K",  
    "B", "37K", "80K",  
    "C", "212K", "213K"  
))
```

```
## # A tibble: 3 × 3  
##   country `1999` `2000`  
##   <chr>    <chr>  <chr>  
## 1 A        0.7K   2K  
## 2 B        37K    80K  
## 3 C       212K   213K
```

```
pivot_longer(d, cols = "1999":"2000", names_to = "year", values_to = "cases")
```

```
## # A tibble: 6 × 3  
##   country year  cases  
##   <chr>    <chr> <chr>  
## 1 A        1999  0.7K  
## 2 A        2000  2K  
## 3 B        1999  37K  
## 4 B        2000  80K  
## 5 C       1999  212K
```

Long -> Wide

The diagram illustrates the transformation of a long-format data frame into a wide-format data frame. On the left, a long-format data frame is shown with columns: country, year, type, and count. The data consists of 12 rows for three countries (A, B, C) across two years (1999, 2000), with each country having two entries per year, one for 'cases' and one for 'pop'. An arrow points from this long-format frame to a wide-format data frame on the right. In the wide-format frame, the columns are country, year, cases, and pop. The data is now organized by country and year, with all 'cases' values grouped under the 'cases' column and all 'pop' values grouped under the 'pop' column.

| country | year | type | count |
|---------|------|-------|-------|
| A | 1999 | cases | 0.7K |
| A | 1999 | pop | 19M |
| A | 2000 | cases | 2K |
| A | 2000 | pop | 20M |
| B | 1999 | cases | 37K |
| B | 1999 | pop | 172M |
| B | 2000 | cases | 80K |
| B | 2000 | pop | 174M |
| C | 1999 | cases | 212K |
| C | 1999 | pop | 1T |
| C | 2000 | cases | 213K |
| C | 2000 | pop | 1T |

| country | year | cases | pop |
|---------|------|-------|------|
| A | 1999 | 0.7K | 19M |
| A | 2000 | 2K | 20M |
| B | 1999 | 37K | 172M |
| B | 2000 | 80K | 174M |
| C | 1999 | 212K | 1T |
| C | 2000 | 213K | 1T |

pivot_wider (previously spread)

Syntax

```
d = tribble::tribble(  
  ~country, ~year, ~type, ~count,  
  "A", 1999, "cases", "0.7K",  
  "A", 1999, "pop", "19M",  
  "A", 2000, "cases", "2K",  
  "A", 2000, "pop", "20M",  
  "B", 1999, "cases", "37K",  
  "B", 1999, "pop", "172M",  
  "B", 2000, "cases", "80K",  
  "B", 2000, "pop", "174M",  
  "C", 1999, "cases", "212K",  
  "C", 1999, "pop", "1T",  
  "C", 2000, "cases", "213K",  
  "C", 2000, "pop", "1T"  
)
```

```
d  
## # A tibble: 12 × 4  
##   country year type count  
##   <chr>    <dbl> <chr> <chr>  
## 1 A        1999 cases "0.7K"  
## 2 A        1999 pop   "19M"  
## 3 A        2000 cases "2K"  
## 4 A        2000 pop   "20M"  
## 5 B        1999 cases "37K"  
## 6 B        1999 pop   "172M"  
## 7 B        2000 cases "80K"  
## 8 B        2000 pop   "174M"  
## 9 C        1999 cases "212K"  
## 10 C       1999 pop   "1T"  
## 11 C       2000 cases "213K"  
## 12 C       2000 pop   "1T"
```

```
pivot_wider(d, id_cols = country:year, names_from = type, values_from = count)
```

```
## # A tibble: 6 × 4  
##   country year cases pop  
##   <chr>    <dbl> <chr> <chr>
```

Separate

The diagram illustrates the process of separating a single column into two distinct columns. On the left, there is a table with three columns: 'country', 'year', and 'rate'. The 'rate' column contains values like '0.7K/19M' and '2K/20M', where the first part ('0.7K') is highlighted in orange and the second part ('19M') is highlighted in blue. An arrow points from this table to the right, indicating the transformation. On the right, there are two separate tables. The first table has four columns: 'country', 'year', 'cases', and 'pop'. The 'cases' column contains values like '0.7K' and '2K', both highlighted in orange. The 'pop' column contains values like '19M' and '20M', both highlighted in blue. The second table also has four columns: 'country', 'year', 'cases', and 'pop', with similar color-coded values.

| country | year | rate | |
|---------|------|----------|--|
| A | 1999 | 0.7K/19M | |
| A | 2000 | 2K/20M | |
| B | 1999 | 37K/172M | |
| B | 2000 | 80K/174M | |
| C | 1999 | 212K/1T | |
| C | 2000 | 213K/1T | |

| country | year | cases | pop |
|---------|------|-------|-----|
| A | 1999 | 0.7K | 19M |
| A | 2000 | 2K | 20M |
| B | 1999 | 37K | 172 |
| B | 2000 | 80K | 174 |
| C | 1999 | 212K | 1T |
| C | 2000 | 213K | 1T |

```
separate(d, rate, sep = "/", into = c("cases", "pop"))
```

Unite

| country | century | year |
|---------|---------|------|
| Afghan | 19 | 99 |
| Afghan | 20 | 0 |
| Brazil | 19 | 99 |
| Brazil | 20 | 0 |
| China | 19 | 99 |
| China | 20 | 0 |

→

| country | year |
|---------|------|
| Afghan | 1999 |
| Afghan | 2000 |
| Brazil | 1999 |
| Brazil | 2000 |
| China | 1999 |
| China | 2000 |

```
unite(d, century, year, col = "year", sep = "")
```

Example 1 - tidy grades

Is the following data tidy?

```
(grades = tibble::tribble(  
  ~name, ~hw_1, ~hw_2, ~hw_3, ~hw_4, ~proj_1, ~proj_2,  
  "Alice",    19,    19,    18,    20,      89,      95,  
  "Bob",      18,    20,    18,    16,      77,      88,  
  "Carol",    18,    20,    18,    17,      96,      99,  
  "Dave",     19,    19,    18,    19,      86,      82  
)
```

```
## # A tibble: 4 × 7  
##   name   hw_1   hw_2   hw_3   hw_4 proj_1 proj_2  
##   <chr> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>  
## 1 Alice     19     19     18     20      89      95  
## 2 Bob       18     20     18     16      77      88  
## 3 Carol     18     20     18     17      96      99  
## 4 Dave      19     19     18     19      86      82
```

How would we calculate a final score based on the following formula, $\text{score} = 0.5 \cdot \frac{\sum_i \text{hw}_i}{80} + 0.5 \cdot \frac{\sum_j \text{proj}_j}{200}$

Semi-tidy approach

```
grades %>%  
  mutate(  
    hw_avg = (hw_1+hw_2+hw_3+hw_4)/4,  
    proj_avg = (proj_1+proj_2)/2  
  ) %>%  
  mutate(  
    overall = 0.5*(proj_avg/100) + 0.5*(hw_avg/20)  
  )  
  
## # A tibble: 4 × 10  
##   name   hw_1   hw_2   hw_3   hw_4 proj_1 proj_2 hw_avg proj_avg overall  
##   <chr> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>   <dbl>     <dbl>   <dbl>  
## 1 Alice    19    19    18    20     89     95    19      92    0.935  
## 2 Bob      18    20    18    16     77     88    18     82.5    0.862  
## 3 Carol    18    20    18    17     96     99   18.2    97.5    0.944  
## 4 Dave     19    19    18    19     86     82   18.8     84    0.889
```

pivot_longer (Wide -> Long)

```
tidyR::pivot_longer(  
  grades,  
  cols = hw_1:proj_2,  
  names_to = "assignment",  
  values_to = "score"  
)  
  
## # A tibble: 24 × 3  
##   name  assignment score  
##   <chr> <chr>      <dbl>  
## 1 Alice hw_1          19  
## 2 Alice hw_2          19  
## 3 Alice hw_3          18  
## 4 Alice hw_4          20  
## 5 Alice proj_1        89  
## 6 Alice proj_2        95  
## 7 Bob   hw_1          18  
## 8 Bob   hw_2          20  
## 9 Bob   hw_3          18  
## 10 Bob  hw_4          16  
## # ... with 14 more rows
```

What does this get us?

```
tidyr::pivot_longer(  
  grades,  
  cols = hw_1:proj_2,  
  names_to = c("type", "id"),  
  names_sep = "_",  
  values_to = "score"  
)  
  
## # A tibble: 24 × 4  
##   name  type  id  score  
##   <chr> <chr> <chr> <dbl>  
## 1 Alice  hw    1     19  
## 2 Alice  hw    2     19  
## 3 Alice  hw    3     18  
## 4 Alice  hw    4     20  
## 5 Alice  proj  1     89  
## 6 Alice  proj  2     95  
## 7 Bob    hw    1     18  
## 8 Bob    hw    2     20  
## 9 Bob    hw    3     18  
## 10 Bob   hw    4     16  
## # ... with 14 more rows
```

Tidy approach?

```
grades %>%  
  tidyr::pivot_longer(  
    cols = hw_1:proj_2,  
    names_to = c("type", "id"),  
    names_sep = "_",  
    values_to = "score"  
) %>%  
  group_by(name, type) %>%  
  summarize(  
    total = sum(score),  
    .groups = "drop"  
)
```

```
## # A tibble: 8 × 3  
##   name  type  total  
##   <chr> <chr> <dbl>  
## 1 Alice  hw      76  
## 2 Alice  proj    184  
## 3 Bob    hw      72  
## 4 Bob    proj    165  
## 5 Carol  hw      73  
## 6 Carol  proj    195  
## 7 Dave   hw      75  
## 8 Dave   proj    168
```

pivot_wider - (Long -> Wide)

```
grades %>%  
  tidyr::pivot_longer(  
    cols = hw_1:proj_2,  
    names_to = c("type", "id"),  
    names_sep = "_",  
    values_to = "score"  
) %>%  
  group_by(name, type) %>%  
  summarize(  
    total = sum(score),  
    .groups = "drop"  
) %>%  
  tidyr::pivot_wider(  
    names_from = type,  
    values_from = total  
)  
  
## # A tibble: 4 × 3  
##   name    hw  proj  
##   <chr> <dbl> <dbl>  
## 1 Alice     76   184  
## 2 Bob       72   165  
## 3 Carol     73   195  
## 4 Dave      75   168
```

Wrapping up

```
grades %>%  
  tidyr::pivot_longer(  
    cols = hw_1:proj_2,  
    names_to = c("type", "id"),  
    names_sep = "_",  
    values_to = "score"  
) %>%  
  group_by(name, type) %>%  
  summarize(  
    total = sum(score),  
    .groups = "drop"  
) %>%  
  tidyr::pivot_wider(  
    names_from = type,  
    values_from = total  
) %>%  
  mutate(  
    score = 0.5*(hw/80) + 0.5*(proj/200)  
)
```

```
## # A tibble: 4 × 4  
##   name     hw   proj  score  
##   <chr> <dbl> <dbl> <dbl>  
## 1 Alice     76    184  0.935
```

Exercise 1

The `palmerpenguin` package contains measurement data on various penguin species on islands near Palmer Station in Antarctica. The code below shows the # of each species measured on each of the three islands (missing island, penguin pairs implies that species does not occur on that island).

```
palmerpenguins::penguins %>%  
  count(island, species)
```

```
## # A tibble: 5 × 3  
##   island    species     n  
##   <fct>    <fct>     <int>  
## 1 Biscoe    Adelie      44  
## 2 Biscoe    Gentoo     124  
## 3 Dream     Adelie      56  
## 4 Dream     Chinstrap   68  
## 5 Torgersen Adelie      52
```

Starting from these data construct a contingency table of counts for island (rows) by species (columns) using the pivot functions we've just discussed.

Rectangling

Star Wars & repurrrsive

repurrrsive is a package that contains a number of interesting example data sets that are stored in a hierarchical format. Many come from web-based APIs which provide results as JSON.

```
str(repurrrsive::sw_people)
```

```
## List of 87
## $ :List of 16
##   ..$ name      : chr "Luke Skywalker"
##   ..$ height    : chr "172"
##   ..$ mass      : chr "77"
##   ..$ hair_color: chr "blond"
##   ..$ skin_color: chr "fair"
##   ..$ eye_color : chr "blue"
##   ..$ birth_year: chr "19BBY"
##   ..$ gender     : chr "male"
##   ..$ homeworld : chr "http://swapi.co/api/planets/1/"
##   ..$ films      : chr [1:5] "http://swapi.co/api/films/6/" "http://swapi.co/api/films/3/" "http://swapi.co/ap
##   ..$ species    : chr "http://swapi.co/api/species/1/"
##   ..$ vehicles   : chr [1:2] "http://swapi.co/api/vehicles/14/" "http://swapi.co/api/vehicles/30/"
##   ..$ starships  : chr [1:2] "http://swapi.co/api/starships/12/" "http://swapi.co/api/starships/22/"
##   ..$ created    : chr "2014-12-09T13:50:51.644000Z"
##   ..$ edited     : chr "2014-12-20T21:17:56.891000Z"
```

View(repurrrsive::sw_people)

The screenshot shows a software interface with a toolbar at the top containing icons for back, forward, search, and other operations. A search bar is present. Below the toolbar is a table with three columns: Name, Type, and Value. The table displays data for multiple characters, with the first character's details expanded.

| Name | Type | Value |
|------------------------|---------------|---|
| repurrrsive::sw_people | list [87] | List of length 87 |
| [[1]] | list [16] | List of length 16 |
| name | character [1] | 'Luke Skywalker' |
| height | character [1] | '172' |
| mass | character [1] | '77' |
| hair_color | character [1] | 'blond' |
| skin_color | character [1] | 'fair' |
| eye_color | character [1] | 'blue' |
| birth_year | character [1] | '19BBY' |
| gender | character [1] | 'male' |
| homeworld | character [1] | 'http://swapi.co/api/planets/1/' |
| films | character [5] | 'http://swapi.co/api/films/6/' 'http://swapi.co/api/films/3/' 'http://swapi.co/a ...' |
| species | character [1] | 'http://swapi.co/api/species/1/' |
| vehicles | character [2] | 'http://swapi.co/api/vehicles/14/' 'http://swapi.co/api/vehicles/30/' |
| starships | character [2] | 'http://swapi.co/api/starships/12/' 'http://swapi.co/api/starships/22/' |
| created | character [1] | '2014-12-09T13:50:51.644000Z' |
| edited | character [1] | '2014-12-20T21:17:56.891000Z' |
| url | character [1] | 'http://swapi.co/api/people/1/' |
| [[2]] | list [14] | List of length 14 |
| [[3]] | list [14] | List of length 14 |
| [[4]] | list [15] | List of length 15 |
| [[5]] | list [15] | List of length 15 |

Tidy data from nested lists

Recent versions of `tidyverse` have added several functions that are designed to aid in the tidying of hierarchical data. Since they are part of `tidyverse` all of the following functions work with data frames.

From `tidyverse` - `hoist()`, `unnest_longer()`, and `unnest_wider()` provide tools for rectangling, collapsing deeply nested lists into regular columns.

Lists as columns

```
(sw_df = tibble::tibble(  
  people = repurrrsive::sw_people  
)
```

```
## # A tibble: 87 × 1  
##   people  
##   <list>  
## 1 <named list [16]>  
## 2 <named list [14]>  
## 3 <named list [14]>  
## 4 <named list [15]>  
## 5 <named list [15]>  
## 6 <named list [14]>  
## 7 <named list [14]>  
## 8 <named list [14]>  
## 9 <named list [15]>  
## 10 <named list [16]>  
## # ... with 77 more rows
```

```
is.data.frame(sw_df)
```

```
## [1] TRUE
```

```
sw_df %>%  
  as.data.frame() %>%  
  head()
```

```
##  
## 1 Luke Skywalker, 172, 77, blond, fair, blue, 19BBY,  
## 2  
## 3  
## 4  
## 5  
## 6
```

Unnesting

```
sw_df %>%  
  unnest_wider(people)
```

```
## # A tibble: 87 × 16  
##   name      height mass hair_color skin_color eye_color birth_year gender  
##   <chr>     <chr> <chr> <chr>    <chr>    <chr>    <chr>    <chr>  
## 1 Luke Skywalker 172    77  blond     fair      blue     19BBY    male  
## 2 C-3PO          167    75  n/a       gold      yellow   112BBY   n/a  
## 3 R2-D2          96     32  n/a       white, bl... red     33BBY    n/a  
## 4 Darth Vader   202    136 none      white      yellow   41.9BBY   male  
## 5 Leia Organa   150    49  brown     light      brown    19BBY    female  
## 6 Owen Lars     178    120 brown, gr... light      blue    52BBY    male  
## 7 Beru Whitesun... 165    75  brown     light      blue    47BBY    female  
## 8 R5-D4          97     32  n/a       white, red red     unknown  n/a  
## 9 Biggs Darklig... 183    84  black     light      brown   24BBY    male  
## 10 Obi-Wan Kenobi 182    77  auburn, w... fair      blue-gray 57BBY    male  
## # ... with 77 more rows, and 8 more variables: homeworld <chr>, films <list>,  
## #   species <chr>, vehicles <list>, starships <list>, created <chr>,  
## #   edited <chr>, url <chr>
```

More list columns

```
sw_df %>%  
  unnest_wider(people) %>%  
  select(name, starships)
```

```
## # A tibble: 87 × 2  
##   name      starships  
##   <chr>     <list>  
## 1 Luke Skywalker <chr [2]>  
## 2 C-3PO          <NULL>  
## 3 R2-D2          <NULL>  
## 4 Darth Vader   <chr [1]>  
## 5 Leia Organa    <NULL>  
## 6 Owen Lars     <NULL>  
## 7 Beru Whitesun lars <NULL>  
## 8 R5-D4          <NULL>  
## 9 Biggs Darklighter <chr [1]>  
## 10 Obi-Wan Kenobi <chr [5]>  
## # ... with 77 more rows
```

```
sw_df %>%  
  unnest_wider(people) %>%  
  select(name, starships) %>%  
  pull(starships) %>%  
  str()
```

```
## List of 87  
## $ : chr [1:2] "http://swapi.co/api/starships/12/" "  
## $ : NULL  
## $ : NULL  
## $ : chr "http://swapi.co/api/starships/13/"  
## $ : NULL  
## $ : chr "http://swapi.co/api/starships/12/"  
## $ : chr [1:5] "http://swapi.co/api/starships/48/" "  
## $ : chr [1:3] "http://swapi.co/api/starships/59/" "  
## $ : NULL  
## $ : chr [1:2] "http://swapi.co/api/starships/10/" "  
## $ : chr [1:2] "http://swapi.co/api/starships/10/" "  
## $ : NULL  
## $ : NULL
```

Unnest Longer

```
unnest_wider(sw_df, people) %>%  
  select(name, starships) %>%  
  unnest_longer(starships)  
  
## # A tibble: 98 × 2  
##   name          starships  
##   <chr>        <chr>  
## 1 Luke Skywalker http://swapi.co/api/starships/12/  
## 2 Luke Skywalker http://swapi.co/api/starships/22/  
## 3 C-3PO          <NA>  
## 4 R2-D2          <NA>  
## 5 Darth Vader   http://swapi.co/api/starships/13/  
## 6 Leia Organa    <NA>  
## 7 Owen Lars     <NA>  
## 8 Beru Whitesun lars <NA>  
## 9 R5-D4          <NA>  
## 10 Biggs Darklighter http://swapi.co/api/starships/12/  
## # ... with 88 more rows
```

Aside - sw_starships

```
(ships = tibble(ships = repurrrsive::sw_starships) %>%
  unnest_wider(ships) %>%
  select(ship = name, url)
)

## # A tibble: 37 × 2
##   ship                      url
##   <chr>                     <chr>
## 1 Sentinel-class landing craft http://swapi.co/api/starships/5/
## 2 Death Star                  http://swapi.co/api/starships/9/
## 3 Millennium Falcon          http://swapi.co/api/starships/10/
## 4 Y-wing                      http://swapi.co/api/starships/11/
## 5 X-wing                      http://swapi.co/api/starships/12/
## 6 TIE Advanced x1             http://swapi.co/api/starships/13/
## 7 Executor                    http://swapi.co/api/starships/15/
## 8 Slave 1                     http://swapi.co/api/starships/21/
## 9 Imperial shuttle            http://swapi.co/api/starships/22/
## 10 EF76 Nebulon-B escort frigate http://swapi.co/api/starships/23/
## # ... with 27 more rows
```



(Joins)

Joins (left)

`left_join(x, y)`

| | | | |
|---|----|---|----|
| 1 | x1 | 1 | y1 |
| 2 | x2 | 2 | y2 |
| 3 | x3 | 4 | y4 |
| | | 2 | y5 |

Joins (right)

`right_join(x, y)`

| | | | |
|---|----|---|----|
| 1 | x1 | 1 | y1 |
| 2 | x2 | 2 | y2 |
| 3 | x3 | 4 | y4 |

Joins (full / outer)

`full_join(x, y)`

| | | | |
|---|----|---|----|
| 1 | x1 | 1 | y1 |
| 2 | x2 | 2 | y2 |
| 3 | x3 | 4 | y4 |

Joins (inner)

inner_join(x, y)

| | | | |
|---|----|---|----|
| 1 | x1 | 1 | y1 |
| 2 | x2 | 2 | y2 |
| 3 | x3 | 4 | y4 |

Joining people and starships

```
sw_df %>%  
  unnest_wider(people) %>%  
  select(name, starships) %>%  
  unnest_longer(starships) %>%  
  left_join(ships, by = c("starships" = "url"))
```

```
## # A tibble: 98 × 3  
##   name      starships          ship  
##   <chr>     <chr>            <chr>  
## 1 Luke Skywalker http://swapi.co/api/starships/12/ X-wing  
## 2 Luke Skywalker http://swapi.co/api/starships/22/ Imperial shuttle  
## 3 C-3PO           <NA>             <NA>  
## 4 R2-D2           <NA>             <NA>  
## 5 Darth Vader   http://swapi.co/api/starships/13/ TIE Advanced x1  
## 6 Leia Organa    <NA>             <NA>  
## 7 Owen Lars     <NA>             <NA>  
## 8 Beru Whitesun lars <NA>             <NA>  
## 9 R5-D4           <NA>             <NA>  
## 10 Biggs Darklighter http://swapi.co/api/starships/12/ X-wing  
## # ... with 88 more rows
```

Putting it together

```
sw_df %>%
  unnest_wider(people) %>%
  select(name, starships) %>%
  unnest_longer(starships) %>%
  inner_join(ships, by = c("starships" = "url")) %>%
  select(-starships) %>%
  group_by(name) %>%
  summarize(ships = list(ship), .groups = "drop")
```

```
## # A tibble: 20 × 2
##       name      ships
##   <chr>     <list>
## 1 Anakin Skywalker <chr [3]>
## 2 Arvel Crynyd    <chr [1]>
## 3 Biggs Darklighter <chr [1]>
## 4 Boba Fett       <chr [1]>
## 5 Chewbacca       <chr [2]>
## 6 Darth Maul      <chr [1]>
## 7 Darth Vader     <chr [1]>
## 8 Gregar Typho    <chr [1]>
## 9 Grievous        <chr [1]>
## 10 Han Solo        <chr [2]>
## 11 Jek Tono Porkins <chr [1]>
## 12 Lando Calrissian <chr [1]>
```

```
sw_df %>%  
  unnest_wider(people) %>%  
  select(name, starships) %>%  
  unnest_longer(starships) %>%  
  inner_join(starships, by = c("starships" = "url")) %>%  
  select(-starships) %>%  
  group_by(name) %>%  
  summarize(ships = paste(ship, collapse = ", "), .groups = "drop")
```

```
## # A tibble: 20 × 2  
##   name           ships  
##   <chr>          <chr>  
## 1 Anakin Skywalker Trade Federation cruiser, Jedi Interceptor, Naboo fighter  
## 2 Arvel Crynyd    A-wing  
## 3 Biggs Darklighter X-wing  
## 4 Boba Fett      Slave 1  
## 5 Chewbacca     Millennium Falcon, Imperial shuttle  
## 6 Darth Maul    Scimitar  
## 7 Darth Vader   TIE Advanced x1  
## 8 Gregar Typho  Naboo fighter  
## 9 Grievous      Belbullab-22 starfighter  
## 10 Han Solo     Millennium Falcon, Imperial shuttle  
## 11 Jek Tono Porkins X-wing  
## 12 Lando Calrissian Millennium Falcon  
## 13 Luke Skywalker X-wing, Imperial shuttle  
## 14 Nien Nunb    Millennium Falcon  
## 15 Obi-Wan Kenobi Jedi starfighter, Trade Federation cruiser, Naboo star ski...
```

Exercise 2

1. Which planet appeared in the most starwars film (according to the data in `sw_planet`)?
1. Which planet was the homeworld of the most characters in the starwars films?