# **Exam 02 Closed Notes**

**DSST 289: Introduction to Data Science** 

#### 1 Honor

You may only use a pen/pencil and scratch paper on this exam.

"I pledge that I will neither give nor receive unauthorized assistance during the completion of this work."

| Name               |  |  |
|--------------------|--|--|
| Signature          |  |  |
| Section start time |  |  |

### 2 Exam

Please write neatly.

If you cannot solve a problem, write what you do know about the question to maximize partial credit.

Your code will be graded on its quality, which includes both accuracy and proper formatting.

#### 3 Data

We will use tables about music for this exam.

```
library(tidyverse)
library(knitr)
library(kableExtra)
library(broom)

table1 <- tibble(
   artist = c(
    "Taylor Swift", "Drake", "Adele",
    "Radiohead", "The Smile"
   ),
   song = c(
    "Blank Space", "Hotline Bling", "Easy On Me",
    "The National Anthem", "Thin Thing"
   ),
   star_rating = c(2, 3, 4, 5, 5)
)</pre>
```

Table 1: R object name: table1

| artist       | song                | star_rating |
|--------------|---------------------|-------------|
| Taylor Swift | Blank Space         | 2           |
| Drake        | Hotline Bling       | 3           |
| Adele        | Easy On Me          | 4           |
| Radiohead    | The National Anthem | 5           |
| The Smile    | Thin Thing          | 5           |

```
table2 <- tibble(
  artist = c(
    "Taylor Swift", "Drake", "Adele",
    "Radiohead", "The Smile"
),
  lead_performer = c(
    "Taylor Swift", "Drake", "Adele",
    "Thom Yorke", "Thom Yorke"
),
  genre = c("Pop", "Hip-Hop", "Pop", "Rock", "Rock")
)
kable(table2)</pre>
```

Table 2: R object name: table2

| artist       | lead_performer | genre   |
|--------------|----------------|---------|
| Taylor Swift | Taylor Swift   | Pop     |
| Drake        | Drake          | Hip-Hop |
| Adele        | Adele          | Pop     |
| Radiohead    | Thom Yorke     | Rock    |
| The Smile    | Thom Yorke     | Rock    |
|              |                |         |

```
table3 <- tibble(
    artist = c("Taylor Swift", "Drake", "Adele"),
    song = c("Blank Space", "Hotline Bling", "Easy On Me"),
    streams_2015 = c(500, 700, NA),
    streams_2024 = c(600, 900, 1000)
)
kable(table3)</pre>
```

Table 3: R object name: table3

| song                 | streams_2015                 | streams_2024                         |
|----------------------|------------------------------|--------------------------------------|
| Blank Space          | 500                          | 600                                  |
| <b>Hotline Bling</b> | 700                          | 900                                  |
| Easy On Me           | NA                           | 1000                                 |
|                      | Blank Space<br>Hotline Bling | Blank Space 500<br>Hotline Bling 700 |

```
table4 <- tibble(
  lead_performer = c(
    "Taylor Swift", "Drake", "Adele", "Thom Yorke"
  ),
  birth_country = c(
    "United States", "Canada", "England", "England"
  )
)
kable(table4)</pre>
```

Table 4: R object name: table4

| lead_performer | birth_country |
|----------------|---------------|
| Taylor Swift   | United States |
| Drake          | Canada        |
| Adele          | England       |
| Thom Yorke     | England       |

```
table5 <- tibble(</pre>
  id = c(13, "Drizzy", 1988, 15),
  mUSICAL_aRTIST = c(
    "TSwift", "Drake (Aubrey Drake Graham)",
    "Adele (born 1988)",
    "Radiohead and also The Smile"
  BILLBOARDno1YEARSsince2018 = list(
    c(2020, 2022, 2023, 2024),
    c(2018, 2020),
    c(2021),
    "No number one hits"
  gEnRe = c("pop", "hip-Hop", "Pop", "Rock'n'roll")
kable(table5) |>
  kable_styling(bootstrap_options = "striped") |>
  row_spec(2, background = "#fde725") |>
  row_spec(3, background = "#a0da39") |>
  row_spec(4, background = "#4ac16d")
```

Table 5: R object name: table5

| id     | mUSICAL_aRTIST               | BILLBOARDno1YEARSsince2018 | gEnRe       |
|--------|------------------------------|----------------------------|-------------|
| 13     | TSwift                       | 2020, 2022, 2023, 2024     | pop         |
| Drizzy | Drake (Aubrey Drake Graham)  | 2018, 2020                 | hip-Hop     |
| 1988   | Adele (born 1988)            | 2021                       | Pop         |
| 15     | Radiohead and also The Smile | No number one hits         | Rock'n'roll |

```
table6 <- tibble(
  song = c(
    "Blank Space", "Hotline Bling", "Easy On Me",
    "The National Anthem", "Thin Thing"
  ),
  minutes = c(3, 4, 3, 5, 4),
  seconds = c(51, 27, 44, 51, 30)
)
kable(table6)</pre>
```

Table 6: R object name: table6

| song                | minutes | seconds |
|---------------------|---------|---------|
| Blank Space         | 3       | 51      |
| Hotline Bling       | 4       | 27      |
| Easy On Me          | 3       | 44      |
| The National Anthem | 5       | 51      |
| Thin Thing          | 4       | 30      |

# 4 Questions

## 4.1 Write input

Write code to reproduce the table below using the tables defined in the Data section:

```
table2 |>
left_join(table1, by = "artist")
```

```
# A tibble: 5 x 5
  artist
              lead_performer genre
                                    song
                                                        star_rating
  <chr>
              <chr>
                             <chr>
                                    <chr>
                                                             <dbl>
1 Taylor Swift Taylor Swift
                                    Blank Space
                             Pop
                                                                 2
2 Drake
              Drake
                             Hip-Hop Hotline Bling
                                                                 3
3 Adele
              Adele
                             Pop
                                    Easy On Me
                                                                 4
4 Radiohead
              Thom Yorke
                             Rock
                                    The National Anthem
                                                                 5
              Thom Yorke
5 The Smile
                                    Thin Thing
                                                                 5
                             Rock
```

#### 4.2 Draw output

Draw the output of the following code chunk:

```
table3 |>
  pivot_longer(
    cols = starts_with("streams_"),
    names_to = "year",
    names_prefix = "streams_",
    names_transform = as.integer,
    values_to = "streams"
)
```

```
# A tibble: 6 x 4
  artist
              song
                             year streams
  <chr>
              <chr>
                            <int>
                                    <dbl>
1 Taylor Swift Blank Space
                             2015
                                      500
2 Taylor Swift Blank Space
                             2024
                                      600
3 Drake
              Hotline Bling 2015
                                      700
4 Drake
              Hotline Bling 2024
                                      900
5 Adele
              Easy On Me
                             2015
                                       NA
6 Adele
              Easy On Me
                             2024
                                     1000
```

#### 4.3 Songs by English people

Write code to reproduce the table below using the tables defined in the Data section:

```
table1 |>
  left_join(table2 |> select(artist, lead_performer), by = "artist") |>
  left_join(table4, by = "lead_performer") |>
  filter(birth_country == "England")
```

# A tibble: 3 x 5

artist song star\_rating lead\_performer birth\_country

### 4.4 Tidy up Table 5

Name tidy data principles that Table 5 violates and how to fix them.

- 1. mixed values in ids
- 2. non-numeric ids
- 3. nonstandard artist name representation
- 4. non-snake case column names
- 5. multiple values per cell in artist and billboard years
- 6. mismatched genre labels (e.g., "pop" and "Pop")
- 7. row highlights use color for meaning
- 8. multiple datatypes per column

### 4.5 Similar joins

Draw the output of the following code chunks.

```
table1 |>
  inner_join(table3, by = c("artist", "song"))
```

```
# A tibble: 3 x 5
  artist
                              star_rating streams_2015 streams_2024
               song
  <chr>
               <chr>
                                    <dbl>
                                                  <dbl>
                                                                <dbl>
1 Taylor Swift Blank Space
                                        2
                                                    500
                                                                  600
2 Drake
                                         3
               Hotline Bling
                                                    700
                                                                  900
3 Adele
               Easy On Me
                                         4
                                                     NA
                                                                 1000
```

```
table1 |>
  semi_join(table3, by = c("artist", "song"))
```

#### 4.6 Song length

Fill in the blanks in the code below such that it produces the following table.

Rewrite the code in the blank part of the page if need be.

*Nota bene*: The number of blanks does *not* necessarily correspond to the number of characters in the blanked out field.

- length gives the length of the song in seconds.
- long song indicates whether the song is more than four minutes long.

```
_____|>
____join(____, by = ____) |>
____(
    length = ____,
    long_song = if_else(____)
) |>
____(___, ___, long_song)
```

```
table1 |>
  left_join(table6, by = "song") |>
  mutate(
    length = minutes * 60 + seconds,
    long_song = if_else(length > 240, TRUE, FALSE)
) |>
  select(artist, song, length, long_song)
```

```
# A tibble: 5 x 4
  artist song <chr>
                                  length long_song
              <chr>
                                  <dbl> <lgl>
1 Taylor Swift Blank Space
2 Drake Hotline Bling
                                    231 FALSE
                                   267 TRUE
            Easy On Me
3 Adele
                                    224 FALSE
              The National Anthem 351 TRUE
4 Radiohead
5 The Smile
              Thin Thing
                                    270 TRUE
```

# 4.7 Principles of data feminism

Fill in the blanks in the following statements.

*Nota bene*: If you write statements that are similar to those that have been blanked out, you can still receive substantial credit.

| i Principles of data feminism   |  |  |
|---|--|--|
| "The starting point for data feminism is something that goes mostly unac- |  |  |
| knowledged in data science: is not distributed                            |  |  |
| equally in the world."  |  |  |
| Principles of data feminism   |  |  |
| 1. Use data to create   |  |  |
| 2. Recognize that data is   |  |  |
| 3. Make visible   |  |  |

- 0. power is not distributed equally in the world
- 1. Use data to create more just, equitable, and livable futures
- 2. Recognize that data is never neutral or objective
- 3. Make *labor* visible

### 4.8 Normalize Table 2

Draw tables demonstrating how to normalize Table 2 to the highest available normal form.

```
artists <- tibble(</pre>
  artist_id = 1:5,
  artist = c(
    "Taylor Swift", "Drake", "Adele",
    "Radiohead", "The Smile"
  )
artists
# A tibble: 5 x 2
  artist_id artist
     <int> <chr>
          1 Taylor Swift
1
          2 Drake
2
3
         3 Adele
         4 Radiohead
4
        5 The Smile
5
performers <- tibble(</pre>
  performer_id = 1:4,
  lead_performer = c("Taylor Swift", "Drake", "Adele", "Thom Yorke")
performers
# A tibble: 4 x 2
  performer_id lead_performer
         <int> <chr>
1
             1 Taylor Swift
             2 Drake
2
3
             3 Adele
             4 Thom Yorke
genres <- tibble(</pre>
genre_id = 1:3,
 genre = c("Pop", "Hip-Hop", "Rock")
```

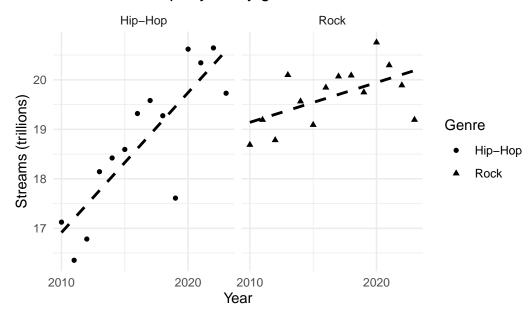
```
genres
# A tibble: 3 x 2
  genre_id genre
    <int> <chr>
1
         1 Pop
2
         2 Hip-Hop
3
         3 Rock
artist_lead <- tibble(</pre>
artist_id = 1:5,
  performer_id = c(1, 2, 3, 4, 4)
artist_lead
# A tibble: 5 x 2
  artist_id performer_id
      <int>
               <dbl>
1
          1
                       1
2
          2
                       2
3
          3
                       3
4
          4
                       4
5
          5
                       4
artist_genre <- tibble(</pre>
 artist_id = 1:5,
 genre_id = c(1, 2, 1, 3, 3)
artist_genre
# A tibble: 5 x 2
  artist_id genre_id
      <int> <dbl>
1
         1
                   1
2
          2
                   2
3
          3
                   1
```

4 4 3 5 5 3

# 4.9 Interpret trends

Interpret the trends in the faceted plot below. How do the trends differ by genre? What do these trends suggest about the past and future of these genres? Why do you think these values differ in the ways that they do?

# Music streams per year by genre



### 4.10 Interpret tidy()

The following tables contain the output of tidy() for the linear models shown above.

#### Hip-hop:

#### Rock:

- 1. Explain what the estimate for the term year means in each table. How and why do they differ?
- 2. Both estimates for the term year are positive. Which real-world phenomena about music streaming might explain this? Identify at least two possibilities.

# 4.11 Question values

| Question Title                  | Points |
|---------------------------------|--------|
| 1. Write input                  | 3      |
| 2. Draw output                  | 4      |
| 3. Songs by English people      | 4      |
| 4. Tidy up table5               | 6      |
| 5. Similar joins                | 6      |
| 6. Song length                  | 5      |
| 7. Principles of data feminism  | 4      |
| 8. Normalize table2             | 6      |
| 9. Interpret trends             | 6      |
| <pre>10. Interpret tidy()</pre> | 6      |