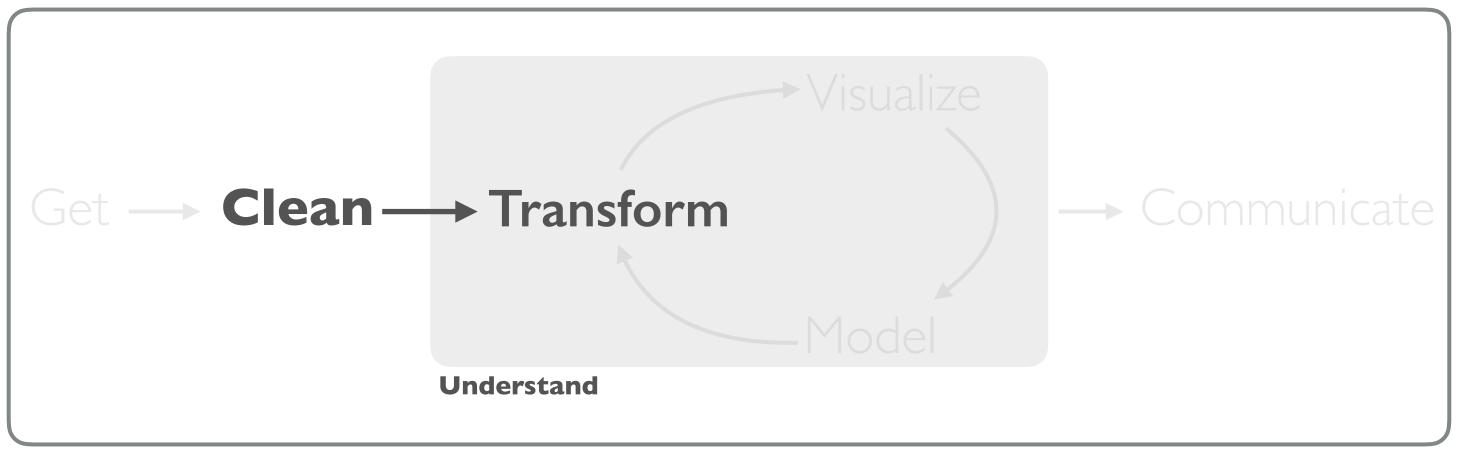
# REGULAR EXPRESSIONS



**Program** 

<sup>†</sup>A modified version of Hadley Wickham's analytic process

"Analysts are often trained to handle tabular or rectangular data that are mostly numeric, but much of the data proliferating today are unstructured and text-heavy."

Julia Silge and David Robinson

# PREREQUISITES



### PACKAGE PREREQUISITE

```
library(tidyverse)

if (packageVersion("devtools") < 1.6) {
   install.packages("devtools")
}

devtools::install_github("bradleyboehmke/harrypotter")
library(harrypotter)</pre>
```

#### REGULAR EXPRESSIONS

- Regular expressions (regex) are strings to identify patterns in text
- Two areas of focus:
  - i. regex functions
  - ii. regex syntax
- The **stringr** package provides us a convenient approach to regex text mining
- We'll explore dealing with regex in both character strings and data frames



### REGEX FUNCTIONS

Dealing with character strings



### DATA PREREQUISITE

#### philosophers\_stone

- [1] "THE BOY WHO LIVED Mr. and Mrs. Dursley, of number four, Privet Drive, were proud to say that they were perfectly normal, thank you very much. They were the last people you'd expect to be involved in anything strange or mysterious, because they just didn't hold with such nonsense. Mr. Dursley was the director of a firm called Grunnings, which made drills. He was a big, beefy man with hardly any neck, although he did have a very large mustache. Mrs. Dursley was thin and blonde and had nearly twice the usual amount of neck, which came in very useful as she spent so much of her time craning over garden fences, spying on the neighbors. The Dursleys had a small son called Dudley and in their opinion there was no finer boy anywhere. The Dursleys had everything they wanted, but they also had a secret, and their greatest fear was that somebody would discover it. They didn't think they could bear it if anyone found out about the Potters. Mrs. Potter was Mrs. Dursley's sister, but they h... <truncated>
- [2] "THE VANISHING GLASS Nearly ten years had passed since the Dursleys had woken up to find their nephew on the front step, but Privet Drive had hardly changed at all. The sun rose on the same tidy front gardens and lit up the brass number four on the Dursleys' front door; it crept into their living room, which was almost exactly the same as it had

str\_\*(string, pattern)

string: character vector

pattern: regex pattern to look for

str\_detect: does the expression
exist?

```
str_detect(philosophers_stone, "Harry")
str_count(philosophers_stone, "Harry")
[1] 20 79 68 48 147 117 63 49 70 82 68
[12] 99 62 45 93 116 99
```

str\_count: how many instances
are there?

```
str_detect(philosophers_stone, "Harry")
str_count(philosophers_stone, "Harry")
str_extract(philosophers_stone, "Harry")
[1] "Harry" "Harry" "Harry" "Harry" "Harry"
[6] "Harry" "Harry" "Harry" "Harry" "Harry"
[11] "Harry" "Harry" "Harry" "Harry" "Harry"
[16] "Harry" "Harry"
```

str\_extract: extract the first
instance

```
str_detect(philosophers_stone, "Harry")
str_count(philosophers_stone, "Harry")
str_extract(philosophers_stone, "Harry")
str_extract_all(philosophers_stone, "Harry")
\Gamma\Gamma177
 [1] "Harry" "Harry" "Harry" "Harry"
    "Harry" "Harry" "Harry" "Harry"
    "Harry" "Harry" "Harry" "Harry"
[16] "Harry" "Harry" "Harry" "Harry" "Harry"
 [1] "Harry" "Harry" "Harry" "Harry" "Harry"
 [6] "Harry" "Harry" "Harry" "Harry"
    "Harry" "Harry" "Harry" "Harry" "Harry"
[16] "Harry" "Harry" "Harry" "Harry"
```

str\_extract\_all: extract all
instances

```
str_detect(philosophers_stone, "Harry")
str_count(philosophers_stone, "Harry")
str_extract(philosophers_stone, "Harry")
str_extract_all(philosophers_stone, "Harry")
str_locate_all(philosophers_stone, "Harry")
[[1]]
      start
              end
       5243
             5247
             5802
       5798
            5872
       5868
 [4,] 10231 10235
 [5,] 18057 18061
 [6,] 18190 18194
 [7,] 18521 18525
```

str\_locate\_all: locate the
position of all instances

#### YOURTURN!

Take 5 minutes to explore the various str\_\* functions

### REGEX SYNTAX

 $([a-z][\Lambda a-z0-9]$ 

Dealing with character strings

```
str_count(philosophers_stone, "Harry Potter")
```

[1] 5 2 0 2 3 5 1 1 0 0 0 0 0 1 5 0 3

Phrases

```
str_count(philosophers_stone, "Harry Potter")
str_count(philosophers_stone, "Harry|Potter")
[1] 28 57 56 30 109 76 50 44 55 67 52 73 52
[14] 31 70 80 61
```

"Harry" or "Potter"

```
str_count(philosophers_stone, "Harry Potter")
str_count(philosophers_stone, "Harry I Potter")
str_count(philosophers_stone, "ye(slah)")
[1] 17 5 3 7 25 9 13 5 8 4 5 10 1 4 8 12 8
```

"yes" or "yeah"

```
str_count(philosophers_stone, "Harry Potter")
str_count(philosophers_stone, "Harry | Potter")
str_count(philosophers_stone, "ye(slah)")
str_count(philosophers_stone, "boy")
 [1] 9 7 2 5 15 34 5 1 7 1 0 3 0 0 3 2 6
str_count(philosophers_stone, regex("boy", ignore_case = TRUE))
    10 7 2 5 15 34 5 1 7 1 0 3 0 0 3 2 6
```

← default

← ignore case

#### YOURTURN!

How many times are "Mr" and "Mrs" used in philosophers\_stone?

### SOLUTION

```
str_count(philosophers_stone, "Mr\\.\\s|Mrs\\.\\s") %>% sum
[1] 126
```

#### ANCHORS

^: Identify patterns at the **beginning** of an element

#### ANCHORS

\$: Identify patterns at the end of an element

#### YOURTURN!

Extract all elements in deathly\_hallows that start with "Harry"

#### SOLUTION

deathly\_hallows[str\_detect(deathly\_hallows, "^Harry")]

[1] "Harry was bleeding. Clutching his right hand in his left and swearing under his breath, he shouldered open his bedroom door. There was a crunch of breaking china. He had trodden on a cup of cold tea that had been sitting on the floor outside his bedroom door. \"What the "C?\"He looked around, the landing of number four, Privet Drive, was deserted. Possibly the cup of tea was Dudley's idea of a clever booby trap. Keeping his bleeding hand elevated, Harry scraped the fragments of cup together with the other hand and threw them into the already crammed bin just visible inside his bedroom door. Then he tramped across to the bathroom to run his finger under the tap.It was stupid, pointless, irritating beyond belief that he still had four days left of being unable to perform magic...but he had to admit to himself that this jagged cut in his finger would have defeated him. He had never learned how to repair wounds, and now he came to think of it "C particularly in light of his immediate ... <truncated>

[2] "Harry ran back upstairs to his bedroom, arriving at the window just in time to see the Dursleys' car swinging out of the drive and off up the road. Dedalus's top hat was visible between Aunt Petunia and Dudley in the backseat. The car turned right at the end of Privet Drive, its windows burned scarlet for a moment in the now setting sun, and then it was gone. Harry picked up Hedwig's cage, his Firebolt, and his rucksack, gave his

```
str_extract(philosophers_stone, "Harry.")
[1] "Harry\" "Harry " "Harry " "Harry!"
[5] "Harry " "Harry'" "Harry" "Harry "
[9] "Harry " "Harry " "Harry " "Harry "
[13] "Harry " "Harry," "Harry'" "Harry "
[17] "Harry."
```

.: wild card - any character

```
str_extract(philosophers_stone, "Harry.")
str_extract(philosophers_stone, "\\d")
[1] NA NA "4" "1" "0" "1" NA "3" "3" NA "1" NA
[13] "1" "1" NA "1" NA
```

\\d: digits

```
str_detect(philosophers_stone, "Harry")
str_extract(philosophers_stone, "\\d")
str_extract(philosophers_stone, "[1|4]")
[1] NA NA "4" "1" "1" "1" NA "1" NA NA "1" NA
[13] "1" "1" NA "1" NA
```

[dld]: specified digits

```
str_detect(philosophers_stone, "Harry")
str_count(philosophers_stone, "Harry")
str_extract(philosophers_stone, "[1|4]")
str_extract(philosophers_stone, ".[yz].")
[1] "ey," "ly " "azi" "ey " "ry " "ry'" "ry " " yo"
[9] "ry " "oy " "ey " "oze" "ry " "ey'" "dy " " ye"
[17] "ry."
```

[a-zA-Z]: specified letters

#### YOURTURN!

How many times is the word "Harry" get followed by a word that starts with a vowel in philosophers\_stone?

#### SOLUTION

```
str_count(philosophers_stone, "Harry.[aeiou]") %>% sum
str_count(philosophers_stone, "Harry\\s[aeiou]") %>% sum
[1] 156
```

This is the safer option since \\s specifically identifies white space

#### REPETITION

```
str_extract(philosophers_stone, "[aeiou]{4}")
str_extract(philosophers_stone, "[aeiou]{3,}")
str_extract(philosophers_stone, "[aeiou]{3,4}")
[1] "iou" "uie" "iou" "uee" "iou" "iou" "uie" "uea"
[9] "uie" "iou" "iou" "iou" "eei" "iou" "iou" "iou"
[17] "uie"
```

{n}: find n repetitions
{n,}: find n or more repetitions

{n,m}: find n to m repetitions

#### YOURTURN!

1. Without computer support, what is this finding:

```
str_count(philosophers_stone, regex("((no[[:punct:]])[ ]){3}", ignore_case = TRUE))
```

2. Extract the 25 characters that precede and follow the use of "Harry" in philosophers\_stone

#### SOLUTION

```
str_count(philosophers_stone, regex("((no[[:punct:]])[ ]){3}", ignore_case = TRUE))
Looking for 3 repeated uses of "no" with any form of punctuation and a space following
each use of "no". (i.e. "No, no, no!")
str_extract_all(philosophers_stone, ".{25}Harry.{25}")
 [1] " I heard yes, their son, Harry\" Mr. Dursley stopped de"
 [2] "ter who had a son called Harry. Come to think of it, he"
 [3] "re his nephew was called Harry. He'd never even seen th"
 [4] "in? Howard, isn't it?\" \"Harry. Nasty, common name, if "
 [5] "o kill the Potter's son, Harry. But -- he couldn't. He "
 [6] "at when he couldn't kill Harry Potter, Voldemort's powe"
 [7] "n the name of heaven did Harry survive?\" \"We can only "
 [8] "s?\" \"I've come to bring Harry to his aunt and uncle. T"
 [9] "t, screaming for sweets. Harry Potter come and live her"
[10] "ed if today was known as Harry Potter day in the future"
```

he heales written about Hanny aveny shild in our we"

## REGEX

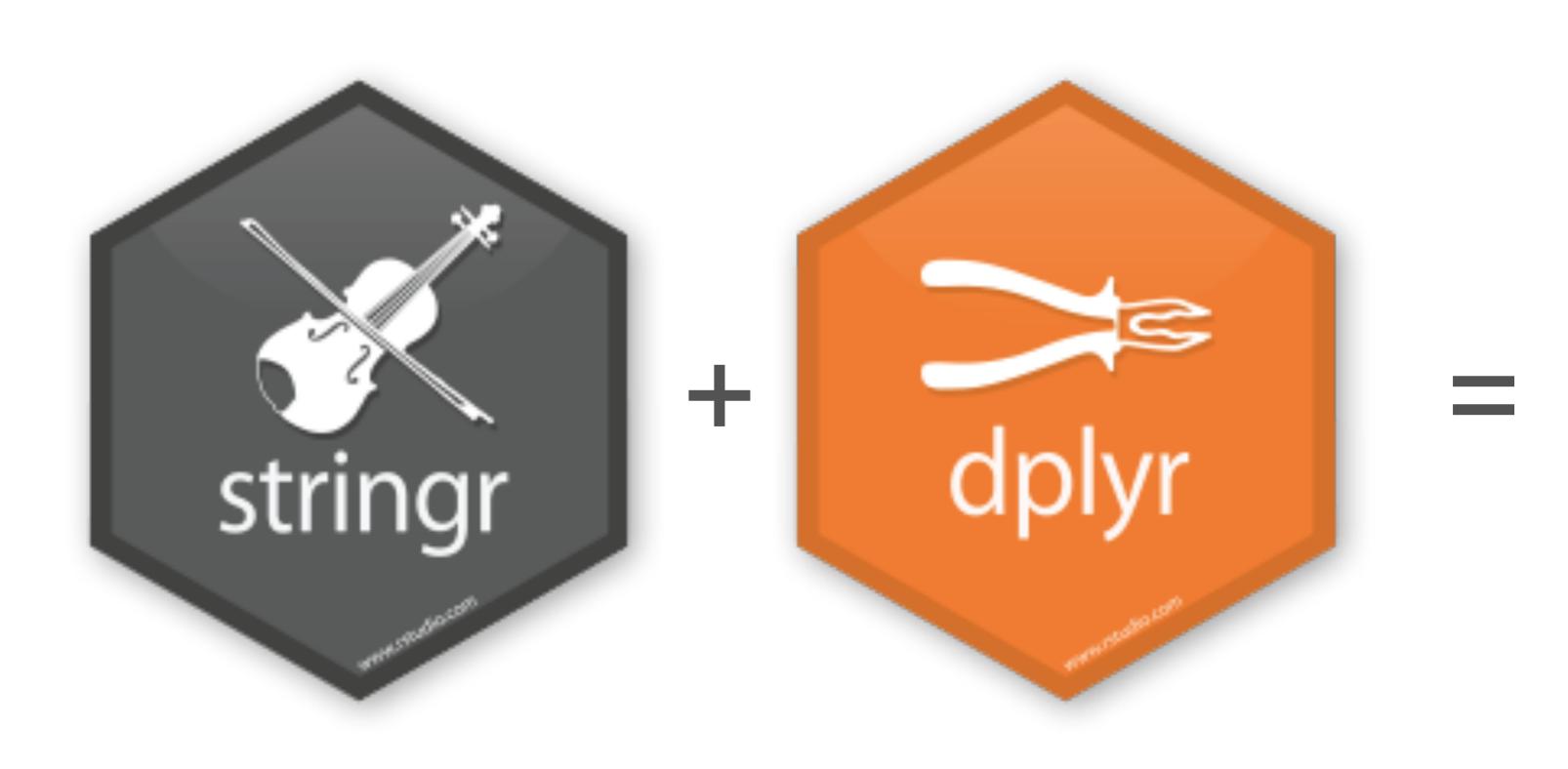
Doing similar stuff with a data frame



### DATA PREREQUISITE

```
airbnb <- read_rds("data/airbnb.rds")</pre>
airbnb
# A tibble: 3,585 × 95
         id
                                       listing_url scrape_id last_scraped
      <int>
                                             <chr>
                                                          <dbl>
                                                                      <date>
   12147973 https://www.airbnb.com/rooms/12147973 2.016091e+13
                                                                  2016-09-07
             https://www.airbnb.com/rooms/3075044 2.016091e+13
                                                                  2016-09-07
    3075044
       6976
                https://www.airbnb.com/rooms/6976 2.016091e+13
                                                                  2016-09-07
             https://www.airbnb.com/rooms/1436513 2.016091e+13
                                                                  2016-09-07
    1436513
             https://www.airbnb.com/rooms/7651065 2.016091e+13
                                                                  2016-09-07
    7651065
   12386020 https://www.airbnb.com/rooms/12386020 2.016091e+13
                                                                  2016-09-07
             https://www.airbnb.com/rooms/5706985 2.016091e+13
                                                                  2016-09-07
    5706985
             https://www.airbnb.com/rooms/2843445 2.016091e+13
                                                                  2016-09-07
8
    2843445
              https://www.airbnb.com/rooms/753446 2.016091e+13
9
     753446
                                                                  2016-09-07
              https://www.ginbph.com/nooms/010100 2 0160010112
                                                                  2016 00 07
```

# DATA FRAME REGEX MADE EASY





# BASICS

```
airbnb %>%
  select(name) %>%
  mutate(character_count = str_count(name))
# A tibble: 3,585 \times 2
                                             name character_count
                                            <chr>
                                                             <int>
                      Sunny Bungalow in the City
                                                                26
               Charming room in pet friendly apt
                                                                33
                Mexican Folk Art Haven in Boston
                                                                32
   Spacious Sunny Bedroom Suite in Historic Home
                                                                45
                              Come Home to Boston
                                                                19
                  Private Bedroom + Great Coffee
                                                                30
             New Lrg Studio apt 15 min to Boston
                                                                35
              "Tranquility" on "Top of the Hill"
                                                                34
              6 miles away from downtown Boston!
                                                                34
10
               Perfect & Practical Boston Rental
                                                                33
# ... with 3,575 more rows
```

 We can use str\_count to count the number of characters in a character field

### BASICS

```
airbnb %>%
  select(name) %>%
  mutate(first_five = str_sub(name, start = 1, end = 5),
         last_five = str_sub(name, start = -5))
# A tibble: 3,585 \times 3
                                             name first_five last_five
                                                        <chr>
                                            <chr>
                                                                  <chr>
                      Sunny Bungalow in the City
                                                                   City
                                                        Sunny
               Charming room in pet friendly apt
                                                        Charm
                                                                  y apt
                Mexican Folk Art Haven in Boston
                                                       Mexic
                                                                  oston
   Spacious Sunny Bedroom Suite in Historic Home
                                                                   Home
                                                        Spaci
5
                              Come Home to Boston
                                                        Come
                                                                  oston
                  Private Bedroom + Great Coffee
6
                                                        Priva
                                                                  offee
             New Lrg Studio apt 15 min to Boston
                                                       New L
                                                                  oston
              "Tranquility" on "Top of the Hill"
                                                                  Hill"
                                                        "Tran
              6 miles away from downtown Boston!
                                                        6 mil
                                                                  ston!
               Perfect & Practical Boston Rental
10
                                                        Perfe
                                                                  ental
# ... with 3,575 more rows
```

We can use str\_sub with start
 and end arguments to take out a
 substring

#### BASICS

```
airbnb %>%
  select(host_name) %>%
  mutate(lower_case = str_to_lower(host_name),
         upper_case = str_to_upper(host_name))
# A tibble: 3,585 × 3
   host_name lower_case upper_case
       <chr>
                  <chr>
                             <chr>
    Virginia
               virginia
                          VIRGINIA
               andrea
      Andrea
                            ANDREA
        Phil
                              PHIL
                   phil
                 meghna
      Meghna
                            MEGHNA
       Linda
                  linda
                             LINDA
     Deborah
                deborah
                           DEBORAH
                 juliet
      Juliet
                            JULIET
     Marilyn
                marilyn
                           MARILYN
        Sami
                   sami
                              SAMI
10
                             DAMON
       Damon
                  damon
# ... with 3,575 more rows
```

 We can use str\_to\_lower and str\_to\_upper to normalize text case

#### YOURTURN!

1. What is the average number of characters used in the **name** column? What about the **description** column?

2. What is the most common name in the **host\_name** column?

# SOLUTION

```
# problem 1
airbnb %>%
  select(name, description) %>%
  mutate(
    name\_char = str\_count(name),
    desc_char = str_count(description)
    ) %>%
  summarise(
    name_char = mean(name_char, na.rm = TRUE),
    desc_char = mean(desc_char, na.rm = TRUE)
# A tibble: 1 \times 2
  name_char desc_char
                <dbl>
      <dbl>
1 32.34728 768.5431
```

# SOLUTION

```
# problem 2
airbnb %>%
  select(host_name) %>%
  mutate(host_name = str_to_lower(host_name)) %>%
  count(host_name, sort = TRUE)
# A tibble: 1,334 × 2
   host_name
       <chr> <int>
        kara
               138
    seamless
             71
        mike
    flatbook
      alicia
                50
                42
       marie
       jason
                35
       sarah
                26
```

```
airbnb %>%
 select(name) %>%
 mutate(charming = str_detect(name, regex("charming", ignore_case = TRUE)))
 # A tibble: 3,585 \times 2
                                               name charming
                                              <chr>
                                                       <lgl>
                        Sunny Bungalow in the City
                                                       FALSE
                Charming room in pet friendly apt
                                                        TRUE
                 Mexican Folk Art Haven in Boston
                                                       FALSE
    Spacious Sunny Bedroom Suite in Historic Home
                                                       FALSE
 5
                               Come Home to Boston
                                                       FALSE
                    Private Bedroom + Great Coffee
                                                       FALSE
 6
              New Lrg Studio apt 15 min to Boston
                                                       FALSE
               "Tranquility" on "Top of the Hill"
                                                       FALSE
               6 miles away from downtown Boston!
                                                       FALSE
 10
                Perfect & Practical Boston Rental
                                                       FALSE
 # ... with 3,575 more rows
```

- We can use str\_detect to see if the word "charming" exists in the name
- Since str\_detect supplies a logical response we can use this for filtering...

```
airbnb %>%
  select(name) %>%
  filter(str_detect(name, regex("charming", ignore_case = TRUE)))
# A tibble: 92 x 1
   name
   <chr>
1 Charming room in pet friendly apt
 2 Cozy room in a charming villa.
 3 Charming Gambrel on a sweet street
 4 Charming 3 bedroom-15 min to Boston
 5 Charming new house-15 min to Boston
 6 Queen room in a charming villa
 7 Charming sunlit house in Boston
 8 Charming Victorian near T
9 Charming 2BD Across from Arboretum
10 Charming Boston Apartment
# ... with 82 more rows
```

- We can use str\_detect to see if the word "charming" exists in the name
- Since str\_detect supplies a logical response we can use this for filtering...

- We can use different approaches to get to the same results
- What do you expect these to return????

```
airbnb %>%
  select(name) %>%
  filter(str_detect(name, "(Clc)harmingl(Clc)ute"))
```

```
airbnb %>%
  select(name) %>%
  mutate(name = str_to_lower(name)) %>%
  filter(str_detect(name, "charming|cute"))
```

• We can use different approaches to get to the same results

```
airbnb %>%
  select(name) %>%
 filter(str_detect(name, "(Clc)harming(Clc)ute"))
# A tibble: 105 x 1
   name
   <chr>
 1 Charming room in pet friendly apt
 2 Cozy room in a charming villa.
 3 Charming Gambrel on a sweet street
 4 Charming 3 bedroom-15 min to Boston
 5 Charming new house-15 min to Boston
 6 Queen room in a charming villa
 7 Charming sunlit house in Boston
 8 Charming Victorian near T
 9 Charming 2BD Across from Arboretum
```

```
airbnb %>%
  select(name) %>%
  mutate(name = str_to_lower(name)) %>%
  filter(str_detect(name, "charming|cute"))
# A tibble: 105 x 1
   name
   <chr>
 1 Charming room in pet friendly apt
 2 Cozy room in a charming villa.
 3 Charming Gambrel on a sweet street
 4 Charming 3 bedroom-15 min to Boston
 5 Charming new house-15 min to Boston
 6 Queen room in a charming villa
 7 Charming sunlit house in Boston
 8 Charming Victorian near T
```

#### YOURTURN!

- 1. Using the house\_rules column, how many observations (aka hosts) advocate for "no shoes"?
- 2. How would you filter out these observations?

# SOLUTION

```
# problem 1
airbnb %>%
  tally(str_detect(house_rules, regex("no shoes", ignore_case = TRUE)))
# A tibble: 1 × 1
  no_shoes
     <int>
# problem 2
airbnb %>%
  filter(!str_detect(house_rules, regex("no shoes", ignore_case = TRUE)))
# A tibble: 2,326 × 95
                                     listing_url scrape_id last_scraped
     <int>
                                           <chr> <dbl> <date>
   12147973 https://www.airbnb.com/rooms/12147973 2.016091e+13
                                                                2016-09-07
             https://www.airbnb.com/rooms/3075044 2.016091e+13
    3075044
                                                                2016-09-07
               https://www.airbnb.com/rooms/6976 2.016091e+13
       6976
                                                                2016-09-07
```

# CLEANING

```
airbnb %>%
 select(name) %>%
 count(str_extract(name, "^[^A-Za-z0-9]+"), sort = TRUE)
# A tibble: 20 x 2
  <chr>
                                <int>
1 NA
                                3468
                                  79
6 #
12 "*** "
```

• Sometimes we need to do some cleaning. For example, if we wanted to look for the most common first words used in names, we may want to clean up non-alphanumeric characters.

# CLEANING

```
airbnb %>%
  select(name) %>%
 mutate(
    name = str_replace_all(name, "[^A-Za-z0-9]+", " "),
    name = str_replace_all(name, "[[:punct:]]+", " "),
    name = str_trim(name),
    name = str_to_lower(name)
    ) %>%
  count(str_extract(name, "^[A-Za-z0-9]+"), sort = TRUE)
# A tibble: 626 x 2
   `str_extract(name, "^[A-Za-z0-9]+")`
   <chr>
                                         <int>
                                           183
 1 cozy
 2 private
                                           169
 3 beautiful
                                           120
 4 spacious
                                           114
                                           104
```

- Remove all non-alphanumerics
- Remove punctuations
- Remove extra white spaces
- Standardize to lowercase
- Extract and count first alphanumeric words

# CHALLENGE



# CHALLENGE

In the Kaggle competition for predicting Titanic survivors, the most important predictor variable ended up being the passenger's title (i.e. Mr., Mrs., Miss., Master).

Using the titanic::titanic\_train data, extract the passengers title and create a new feature named "Title".

# SOLUTION

```
titanic <- titanic::titanic_train %>% as_tibble()
titanic %>%
  mutate(Title = str_replace_all(Name, "(.*, )|(\\..*)", ""))
# A tibble: 891 x 13
                                                                     Age SibSp Parch Ticket Fare Cabin Embarked Title
  PassengerId Survived Pclass Name
                                                             Sex
                <int> <int> <chr>
                                                             <chr> <dbl> <int> <int> <chr>
                                                                                                <dbl> <chr> <chr>
        <int>
                                                                                                                   <chr>
                                                             male 22.0
                                                                                                7.25 ""
                          3 Braund, Mr. Owen Harris
                                                                                  0 A/5 21171
                                                                                                                   Mr
                    0
                          1 Cumings, Mrs. John Bradley (Floren... female 38.0
                                                                                  0 PC 17599
                                                                                                71.3 C85
                                                                                                                   Mrs
                                                                                  0 STON/02. 31... 7.92 ""
                          3 Heikkinen, Miss. Laina
                                                            female 26.0 0
                                                                                                                   Miss
                          1 Futrelle, Mrs. Jacques Heath (Lily... female 35.0
                                                                                  0 113803
                                                                                                53.1 C123 S
                                                                                                                   Mrs
                          3 Allen, Mr. William Henry
                                                                                  0 373450
                                                                                                 8.05 ""
                                                             male 35.0
                                                                                                                   Mr
                                                                                               8.46 ""
                          3 Moran, Mr. James
                                                             male NA
                                                                                  0 330877
                                                                                                                   Mr
            6
                          1 McCarthy, Mr. Timothy J
                                                                                  0 17463
                                                                                                51.9 E46
                                                            male 54.0
                                                                                                                   Mr
```

3 Palsson, Master. Gosta Leonard

10

10

# ... with 881 more rows

3 Johnson, Mrs. Oscar W (Elisabeth V... female 27.0

2 Nasser, Mrs. Nicholas (Adele Achem) female 14.0

male 2.00

21.1 ""

30.1 ""

11.1

Mast...

Mrs

Mrs

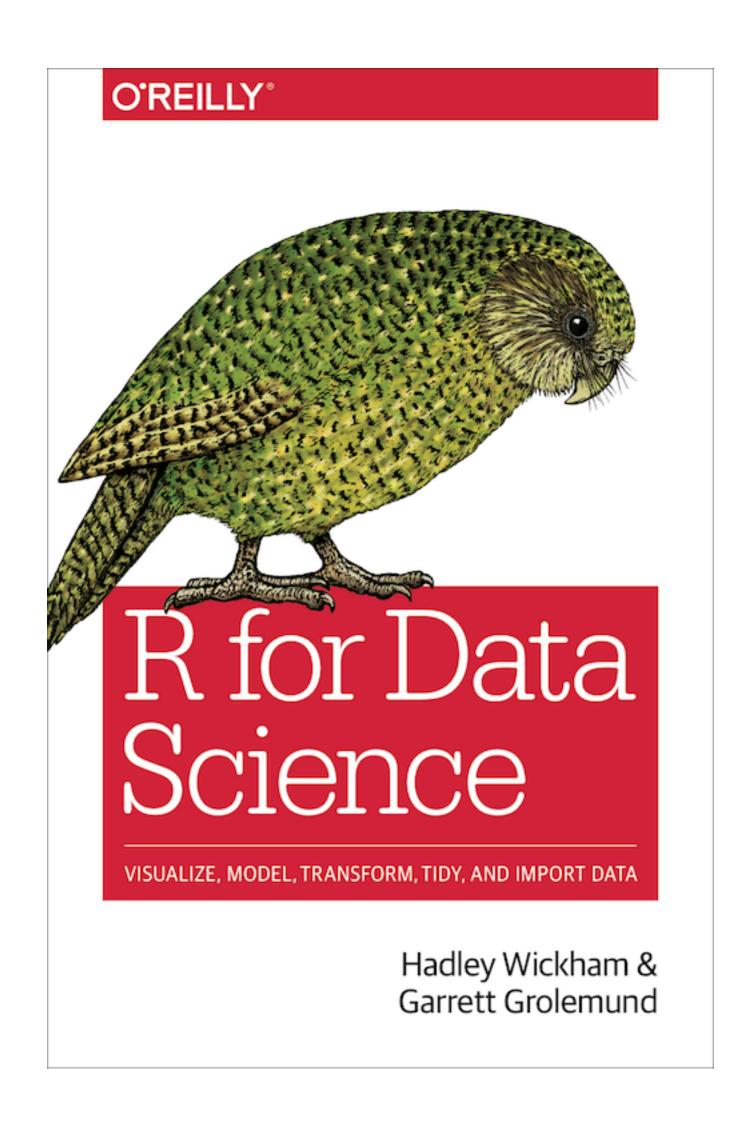
1 349909

2 347742

0 237736



# LEARN MORE



Use R! Bradley Boehmke Data Wrangling with R 

# WHATTO REMEMBER

# FUNCTIONS TO REMEMBER

Operator/Function	Description
str_*	stringr functions for regular expressions
<pre>regex(pattern, ignore_case = TRUE)</pre>	ignore case
"x   y" "(x y)"	using or for finding multiple forms of regular expressions
^ \$	anchors - finding regex at beginning or end of element
., \\d, \\s, [0-9], [a-zA-Z]	finding regex patterns
+, {n}, {n,}, {n,m}	finding repetitions of regex patterns