### Lab2

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#### 15/01/2020

```
knitr::opts_chunk$set(echo = TRUE, message = FALSE, warning = FALSE)
set.seed(1337)
library(opendatatoronto)
library(kableExtra)
library(tidyverse)
## -- Attaching packages ------ tidyverse 1.3.0 --
## v ggplot2 3.2.1
                    v purrr
                              0.3.3
## v tibble 2.1.3 v dplyr
                              0.8.3
## v tidyr 1.0.0 v stringr 1.4.0
## v readr 1.3.1 v forcats 0.4.0
## -- Conflicts -----
                                                 ----- tidyverse conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::group_rows() masks kableExtra::group_rows()
## x dplyr::lag()
                     masks stats::lag()
library(stringr)
library(skimr)
library(visdat)
library(janitor)
##
## Attaching package: 'janitor'
## The following objects are masked from 'package:stats':
##
##
      chisq.test, fisher.test
library(lubridate)
##
## Attaching package: 'lubridate'
## The following object is masked from 'package:base':
##
##
      date
library(ggrepel)
library(tidylog)
##
## Attaching package: 'tidylog'
## The following objects are masked from 'package:dplyr':
```

```
##
##
       add_count, add_tally, anti_join, count, distinct, distinct_all,
##
       distinct_at, distinct_if, filter, filter_all, filter_at, filter_if,
##
       full_join, group_by, group_by_all, group_by_at, group_by_if,
##
       inner_join, left_join, mutate, mutate_all, mutate_at, mutate_if,
##
       rename, rename_all, rename_at, rename_if, right_join, sample_frac,
       sample_n, select, select_all, select_at, select_if, semi_join,
##
##
       slice, summarise, summarise_all, summarise_at, summarise_if,
##
       summarize, summarize_all, summarize_at, summarize_if, tally,
##
       top_frac, top_n, transmute, transmute_all, transmute_at,
##
       transmute_if, ungroup
  The following objects are masked from 'package:tidyr':
##
##
       drop_na, fill, gather, pivot_longer, pivot_wider, replace_na,
##
       spread, uncount
  The following object is masked from 'package:stats':
##
##
##
       filter
```

#### Lab Exercises

To be handed in via submission of Rmd file to GitHub by Thursday 16 January, 5pm.

- 1. Using the opendatatoronto package, download the data on mayoral campaign contributions for 2014. (note: the 2014 file you will get from get\_resource, so just keep the sheet that relates to the Mayor election).
- 2. Clean up the data format (fixing the parsing issue and standardizing the column names using janitor)
- 3. Summarize the variables in the dataset. Are there missing values, and if so, should we be worried about them? Is every variable in the format it should be? If not, create new variable(s) that are in the right format.
- 4. Visually explore the distribution of values of the contributions. What contributions are notable outliers? Do they share a similar characteristic(s)? It may be useful to plot the distribution of contributions without these outliers to get a better sense of the majority of the data.
- 5. List the top five candidates in each of these categories:
  - total contributions
  - mean contribution
  - number of contributions
- 6. Repeat 5 but without contributions from the candidates themselves.
- 7. How many contributors gave money to more than one candidate?

## Data Import (Question 1)

```
all_data <- opendatatoronto::list_packages(limit = 500)
election_resources <- opendatatoronto::list_package_resources("f6651a40-2f52-46fc-9e04-b760c16edd5c")
elections <- opendatatoronto::get_resource("d99bb1f3-949a-4497-bb96-c93bbd203130")
contributions_orig <- elections$`2_Mayor_Contributions_2014_election.xls`
```

#### Cleaning names and Col Types (Question 2)

```
contributions <- contributions_orig %>%
    janitor::row_to_names(1) %>%
    janitor::clean_names()

contributions <- contributions %>% readr::type_convert()
```

#### Data Wrangling stuff (Question 3)

```
skimmed <- skimr::skim(contributions)
skimmed %>% select(-numeric.hist) %>% kable()
```

skim_type	skim_variable	n_missing	complete_rate	character.min	character.max	character.em
character	contributors_name	0	1.0000000	4	31	
character	contributors_address	10197	0.0001961	24	26	
character	contributors_postal_code	0	1.0000000	7	7	
character	contribution_type_desc	0	1.0000000	8	14	
character	goods_or_service_desc	10188	0.0010785	11	40	
character	contributor_type_desc	0	1.0000000	10	11	
character	relationship_to_candidate	10166	0.0032356	6	9	
character	president_business_manager	10197	0.0001961	13	16	
character	authorized_representative	10197	0.0001961	13	16	
character	candidate	0	1.0000000	9	18	
character	office	0	1.0000000	5	5	
logical	ward	10199	0.0000000	NA	NA	
numeric	contribution_amount	0	1.0000000	NA	NA	

contributions <- contributions %>% janitor::remove\_empty()

Ward is all missing so it will get removed by remove\_empty. A couple of variables are pretty much all missing contributors\_address, goods\_or\_service\_desc, relationship\_to\_candidate, president\_business\_manager, authorized\_representative. Most of them pertain to companies and there seem to be only 12 corporate contributions. They are the ones with non-missing address. They have all other values non missing except for relationship to candidate. That variable has 12

There are 7545 unique contributors that gave a total of 10199 contributions.

There are a few very large values for contributions, they were all given to the candidates by themselves.

```
contributions %>% filter(!is.na(relationship_to_candidate)) %>%
   arrange(contribution_amount) %>%
   kableExtra::kable()
```

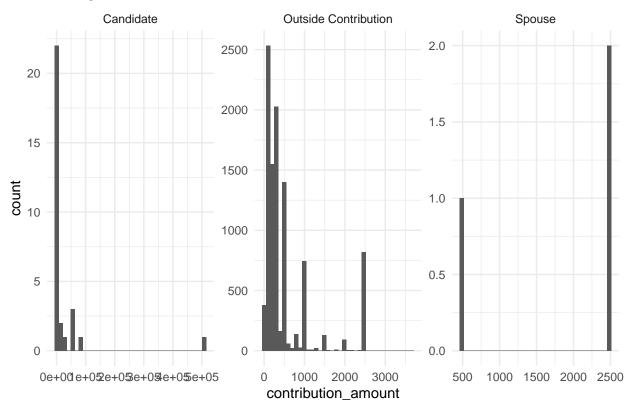
Khomenko, Klim         NA         M6B 2Z7         200.00         Monetary           Mernagh, Matt         NA         M6E 1E1         200.00         Monetary           Emond, Ryan         NA         M4Y 2J3         220.00         Monetary           Ruel, Jim         NA         M4K 3P3         231.70         Monetary           Khomenko, Klim         NA         M6B 2Z7         319.95         Monetary           Walker, Daniel         NA         M6K 2W9         369.32         Monetary           Ford, Doug         NA         M9A 2C3         500.00         Monetary           French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           <	contributors_name	contributors_address	contributors_postal_code	contribution_amount	contribution_type_des
Emond, Ryan         NA         M4Y 2J3         220.00         Monetary           Ruel, Jim         NA         M4K 3P3         231.70         Monetary           Khomenko, Klim         NA         M6B 2Z7         319.95         Monetary           Walker, Daniel         NA         M6K 2W9         369.32         Monetary           Ford, Doug         NA         M9A 2C3         500.00         Monetary           French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Ford, Rob         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed	Khomenko, Klim		M6B 2Z7	200.00	
Ruel, Jim         NA         M4K 3P3         231.70         Monetary           Khomenko, Klim         NA         M6B 2Z7         319.95         Monetary           Walker, Daniel         NA         M6K 2W9         369.32         Monetary           Ford, Doug         NA         M9A 2C3         500.00         Monetary           French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Kalevar, Chai         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Himy         NA         M3C 1C8         2018.00         Monetary				200.00	Monetary
Khomenko, Klim         NA         M6B 2Z7         319.95         Monetary           Walker, Daniel         NA         M6K 2W9         369.32         Monetary           Ford, Doug         NA         M9A 2C3         500.00         Monetary           French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Himy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary	Emond, Ryan	NA	M4Y 2J3	220.00	Monetary
Walker, Daniel         NA         M6K 2W9         369.32         Monetary           Ford, Doug         NA         M9A 2C3         500.00         Monetary           French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M4R 1C4         2500.00         Monetary		NA	M4K 3P3	231.70	Monetary
Ford, Doug         NA         M9A 2C3         500.00         Monetary           French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Himy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M4R 1C4         2500.00         Monetary	Khomenko, Klim	NA	M6B 2Z7	319.95	Monetary
French, James         NA         M9R 3T5         500.00         Monetary           Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	Walker, Daniel	NA	M6K 2W9	369.32	Monetary
Johnson, Suzanne         NA         M5T 1J2         500.00         Monetary           Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary					Monetary
Khomenko, Klim         NA         M6B 2Z7         500.00         Monetary           Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	French, James		M9R 3T5	500.00	Monetary
Tiwari, Ramnarine         NA         M3J 3K3         593.59         Monetary           Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary				500.00	Monetary
Lee, Dewitt         NA         M5H 3L9         700.00         Monetary           Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Himy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary					v
Ford, Rob         NA         M9A 3G9         853.86         Monetary           Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	Tiwari, Ramnarine	NA	M3J 3K3	593.59	Monetary
Kalevar, Chai         NA         M6E 3C5         900.00         Monetary           Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	*				Monetary
Clarke, Kevin         NA         M1E 2R3         1200.00         Monetary           Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	Ford, Rob	NA		853.86	Monetary
Ford, Rob         NA         M9A 3G9         1270.00         Monetary           Syed, Himy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	Kalevar, Chai	NA		900.00	Monetary
Syed, Hïmy         NA         M3C 1C8         2018.00         Monetary           Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary					
Chow, Olivia         NA         M5T 2B6         2500.00         Monetary           Hackett, Barbara         NA         M5R 2B5         2500.00         Monetary           Sniedzins, Erwin         NA         M4R 1C4         2500.00         Monetary	*				
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	,	NA	M5R 2B5	2500.00	Monetary
					Monetary
	Thomson, Sarah	NA	M4W 2X6	2500.00	Monetary
Tory, John NA M5R 2B5 2500.00 Monetary					
Yan, Flora NA M4R 1C4 2500.00 Monetary					
Thomson, Sarah NA M4W 2X6 4425.55 Monetary	· · · · · · · · · · · · · · · · · · ·				Monetary
Di Paola, Rocco NA M3H 2T1 6000.00 Monetary					v
Ford, Rob NA M9A 3G9 12210.00 Monetary	*			12210.00	· ·
Ford, Rob NA M9A 3G9 20000.00 Monetary	, , , , , , , , , , , , , , , , , , ,				Monetary
Goldkind, Ari NA M5P 1P5 23623.63 Monetary	*				Monetary
Ford, Doug NA M9A 2C3 50000.00 Monetary					ū
Ford, Rob NA M9A 3G9 50000.00 Monetary	*				Monetary
Ford, Rob NA M9A 3G9 50000.00 Monetary	Ford, Rob	NA	M9A 3G9	50000.00	Monetary
Ford, Rob NA M9A 3G9 78804.80 Monetary	Ford, Rob	NA	M9A 3G9	78804.80	Monetary
Ford, Doug NA M9A 2C3 508224.73 Monetary	Ford, Doug	NA	M9A 2C3	508224.73	Monetary

# Data Summary (Question 4)

The summary of contribution monetary values is below. It is done separately based on relationship to candidate.

n_unique	mean	median	$\operatorname{sd}$	min	max
10199	607.9521	300	5211.311	1	508224.7

### Histograms of Contribution amounts



Clearly the contributions from the general public tend to be between 0 and 3000, with clear spikes at round numbers like 1000, 2000, 2500. The contributions from people with a relation to the candidate are extremely varied, the spousal ones tend to be very close to the general public, while the candidates like to give themselves a lot of money.

## Question 5

```
contributions_summary_q5 <- contributions %>%
   group_by(candidate) %>%
   summarize(total_contributions = sum(contribution_amount),
        mean_contributions = mean(contribution_amount),
        number_contributions = n())
```

Top total contributions:

```
top_5_total <- contributions_summary_q5 %>%
    arrange(desc(total_contributions)) %>%
    top_n(n = 5, wt = total_contributions)

top_5_total %>% kable()
```

candidate	total_contributions	mean_contributions	number_contributions
Tory, John	2767868.7	1063.7466	2602
Chow, Olivia	1638265.9	287.0122	5708
Ford, Doug	889897.3	1456.4604	611
Ford, Rob	387648.2	720.5356	538
Stintz, Karen	242805.0	995.1025	244

Top average contributions:

```
top_5_mean <- contributions_summary_q5 %>%
    arrange(desc(mean_contributions)) %>%
    top_n(n = 5, wt = mean_contributions)

top_5_mean %>% kable()
```

candidate	total_contributions	mean_contributions	number_contributions
Sniedzins, Erwin	8100.0	2025.000	4
Syed, Hïmy	2018.0	2018.000	1
Ritch, Carlie	5660.0	1886.667	3
Ford, Doug	889897.3	1456.460	611
Clarke, Kevin	1200.0	1200.000	1

Top number of contributions:

```
top_5_number <- contributions_summary_q5 %>%
    arrange(desc(number_contributions)) %>%
    top_n(n = 5, wt = number_contributions)

top_5_number %>% kable()
```

candidate	total_contributions	mean_contributions	number_contributions
Chow, Olivia	1638265.9	287.0122	5708
Tory, John	2767868.7	1063.7466	2602
Ford, Doug	889897.3	1456.4604	611
Ford, Rob	387648.2	720.5356	538
Soknacki, David	132431.0	421.7548	314

### Question 6

Top total contributions:

```
top_5_total <- contributions_summary_q6 %>%
    arrange(desc(total_contributions)) %>%
    top_n(n = 5, wt = total_contributions)

top_5_total %>% kable()
```

candidate	total_contributions	mean_contributions	number_contributions
Tory, John	2765368.7	1063.1944	2601
Chow, Olivia	1635765.9	286.6245	5707
Ford, Doug	331172.6	544.6917	608
Stintz, Karen	242805.0	995.1025	244
Ford, Rob	174509.5	328.6431	531

Top average contributions:

```
top_5_mean <- contributions_summary_q6 %>%
    arrange(desc(mean_contributions)) %>%
    top_n(n = 5, wt = mean_contributions)

top_5_mean %>% kable()
```

candidate	total_contributions	mean_contributions	number_contributions
Ritch, Carlie	5660	1886.667	3
Sniedzins, Erwin	5600	1866.667	3
Tory, John	2765369	1063.194	2601
Gardner, Norman	3000	1000.000	3
Tiwari, Ramnarine	1000	1000.000	1

Top number of contributions:

```
top_5_number <- contributions_summary_q6 %>%
    arrange(desc(number_contributions)) %>%
    top_n(n = 5, wt = number_contributions)

top_5_number %>% kable()
```

candidate	total_contributions	mean_contributions	number_contributions
Chow, Olivia	1635765.9	286.6245	5707
Tory, John	2765368.7	1063.1944	2601
Ford, Doug	331172.6	544.6917	608
Ford, Rob	174509.5	328.6431	531
Soknacki, David	132431.0	421.7548	314

### Question 7

```
contributions_q7 <- contributions %>%
    select(contributors_name, candidate) %>%
    distinct() %>%
    group_by(contributors_name) %>%
    summarize(num_candidates = n()) %>%
    filter(num_candidates > 1)
```

There were 184 people who gave money to more than one candidate.