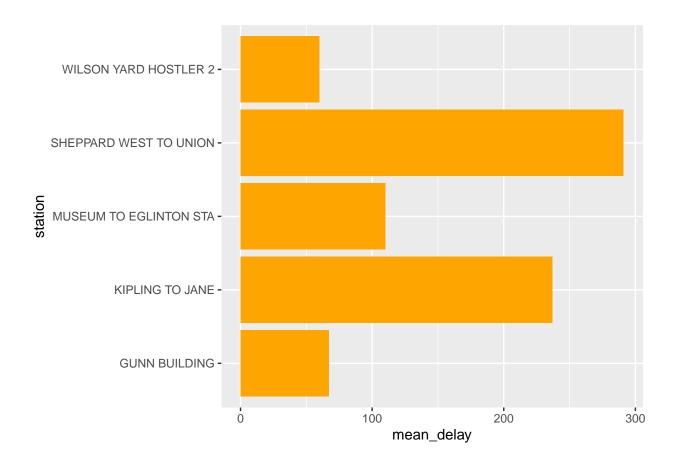
Lab Week 2

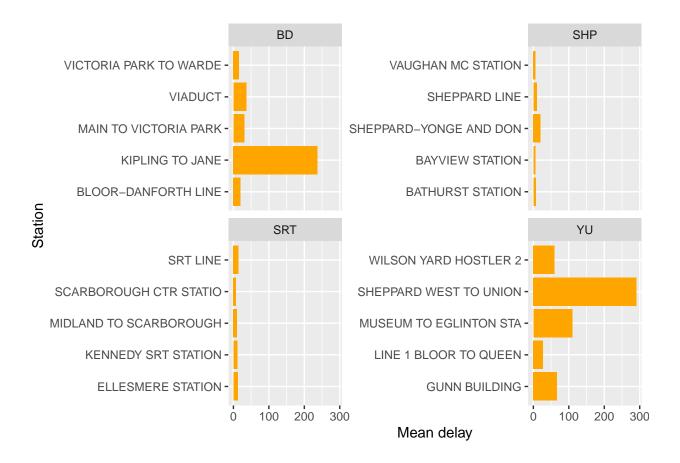
Rosa Fallahpour

• (1) The following plots represent the five stations with the highest mean delays and faceting by variable line, respectively:

```
library(opendatatoronto)
library(tidyverse)
library(stringr)
library(skimr)
library(visdat)
library(janitor)
library(lubridate)
library(ggrepel)
res <- list_package_resources("996cfe8d-fb35-40ce-b569-698d51fc683b")
res <- res |> mutate(year = str_extract(name, "2022"))
delay_2022_ids <- res |> filter(year==2022) |> select(id) |> pull()
delay_2022 <- get_resource(delay_2022_ids)
delay_2022 <- clean_names(delay_2022)
delay_2022 <- delay_2022 |> filter(line %in% c("BD", "YU", "SHP", "SRT"))

delay_2022 |> group_by(station) |> summarise(mean_delay= mean(min_delay)) |> arrange(desc(mean_delay))
```





• (2) Downloading the data on mayoral campaign contributions for 2014:

```
all_data <- list_packages(limit = 500)</pre>
search_res <- all_data %>% filter(str_detect(title, fixed("campaign", ignore_case = T)))
res <- list_package_resources("f6651a40-2f52-46fc-9e04-b760c16edd5c")
may2014 <- get_resource("5b230e92-0a22-4a15-9572-0b19cc222985")$\cdot2_Mayor_Contributions_2014_election.xl
head(may2014)
## # A tibble: 6 x 13
     2014 Munic~1 ...2
                        ...3 ...4 ...5 ...6 ...7 ...8 ...9 ...10 ...11 ...12
                  <chr> <chr>
## 1 Contributor~ Cont~ Cont~ Cont~ Cont~ Good~ Cont~ Rela~ Pres~ Auth~ Cand~ Offi~
## 2 A D'Angelo,~ <NA>
                        M6A ~ 300
                                    Mone~ <NA>
                                                 Indi~ <NA>
                                                             <NA>
                                                                   <NA>
                                                                         Ford~ Mayor
## 3 A Strazar, ~ <NA>
                        M2M ~ 300
                                    Mone~ <NA>
                                                 Indi~ <NA>
                                                             <NA>
                                                                   <NA>
                                                                         Ford~ Mayor
## 4 A'Court, K ~ <NA>
                        M4M ~ 36
                                    Mone~ <NA>
                                                 Indi~ <NA>
                                                             <NA>
                                                                   <NA>
                                                                         Chow~ Mayor
## 5 A'Court, K ~ <NA>
                        M4M ~ 100
                                    Mone~ <NA>
                                                 Indi~ <NA>
                                                             <NA>
                                                                   <NA>
                                                                         Chow~ Mayor
## 6 A'Court, K ~ <NA> M4M ~ 100
                                    Mone~ <NA>
                                                 Indi~ <NA> <NA> <NA> Chow~ Mayor
## # ... with 1 more variable: ...13 <chr>, and abbreviated variable name
       1: '2014 Municipal Election - List of Contributors to Mayoralty Candidates'
```

• (3) Cleaning up the data format:

```
mayoral2014 <- may2014 %>% row_to_names(1) %>% clean_names()
head(mayoral2014)
```

```
## # A tibble: 6 x 13
##
     contributors~1 contr~2 contr~3 contr~4 contr~5 goods~6 contr~7 relat~8 presi~9
                    <chr>
                            <chr>>
                                             <chr>>
                                                     <chr>
                                                             <chr>>
##
     <chr>>
                                     <chr>
                                                                      <chr>>
## 1 A D'Angelo, T~ <NA>
                                             Moneta~ <NA>
                                                             Indivi~ <NA>
                            M6A 1P5 300
                                                                              <NA>
## 2 A Strazar, Ma~ <NA>
                            M2M 3B8 300
                                             Moneta~ <NA>
                                                             Indivi~ <NA>
                                                                              <NA>
## 3 A'Court, K Su~ <NA>
                            M4M 2J8 36
                                             Moneta~ <NA>
                                                             Indivi~ <NA>
                                                                              <NA>
## 4 A'Court, K Su~ <NA>
                            M4M 2J8 100
                                             Moneta~ <NA>
                                                             Indivi~ <NA>
                                                                              <NA>
## 5 A'Court, K Su~ <NA>
                            M4M 2J8 100
                                             Moneta~ <NA>
                                                             Indivi~ <NA>
                                                                              <NA>
                                             Moneta~ <NA>
## 6 Aaron, Robert~ <NA>
                            M6B 1H7 250
                                                             Indivi~ <NA>
                                                                              <NA>
## # ... with 4 more variables: authorized_representative <chr>, candidate <chr>,
       office <chr>, ward <chr>, and abbreviated variable names
       1: contributors_name, 2: contributors_address, 3: contributors_postal_code,
## #
       4: contribution_amount, 5: contribution_type_desc,
## #
## #
       6: goods_or_service_desc, 7: contributor_type_desc,
## #
       8: relationship_to_candidate, 9: president_business_manager
```

• (4) Below displays the table of variables summary. We have large numbers of missing values in some variables such as contributors_address, goods_or_service_desc, relationship_to_candidate, president_business_manager, authorized_representative and ward. Depending on our purpose of data exploration, we can perform an analysis which excludes these variables. Therefore, we should not be worried about them. The contribution_amount variable is in character format which we change it to numeric by creating new variable called "cont_amount".

skim(mayoral2014)

Table 1: Data summary

Name Number of rows Number of columns	mayoral2014 10199 13
Column type frequency:	——————————————————————————————————————
Group variables	None

Variable type: character

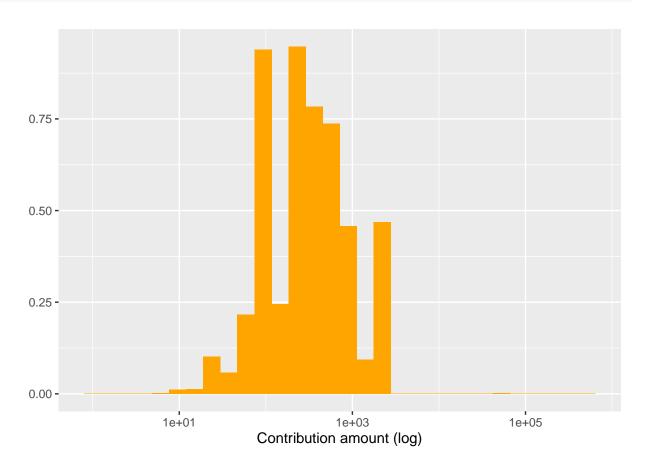
skim_variable	n_missing	complete_rate	min	max	empty	n_unique	whitespace
contributors_name	0	1	4	31	0	7545	0
$contributors_address$	10197	0	24	26	0	2	0
$contributors_postal_code$	0	1	7	7	0	5284	0
$contribution_amount$	0	1	1	18	0	209	0
$contribution_type_desc$	0	1	8	14	0	2	0
$goods_or_service_desc$	10188	0	11	40	0	9	0
$contributor_type_desc$	0	1	10	11	0	2	0
$relationship_to_candidate$	10166	0	6	9	0	2	0
president_business_manager	10197	0	13	16	0	2	0
$authorized_representative$	10197	0	13	16	0	2	0
candidate	0	1	9	18	0	27	0
office	0	1	5	5	0	1	0

skim_variable	n_missing	$complete_rate$	min	max	empty	n_unique	whitespace
ward	10199	0	NA	NA	0	0	0

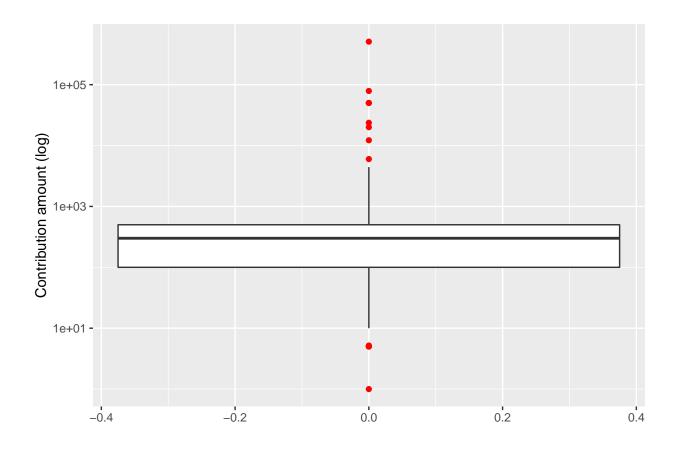
mayoral2014 <- mayoral2014 %>% mutate(cont_amount = as.numeric(contribution_amount))

• (5) The distribution of contribution amount in log scale is as below. We also created the boxplot to better realize the outliers. As we can see, contributions greater than 10000 (in log scale) are outliers. The similar characteristic in these outliers is that they have been contributed by candidates themselves as shown below.

```
#creating histogram for contribution amount in log
mayoral2014 %>% ggplot(aes(x=cont_amount, y=..density..)) +geom_histogram(position="dodge",fill="orange")
```



#creating boxplot for contribution amount to better look for outliers
mayoral2014 %>% ggplot(aes(y = cont_amount)) +geom_boxplot(outlier.colour = "red")+labs(x="",y="Contrib")

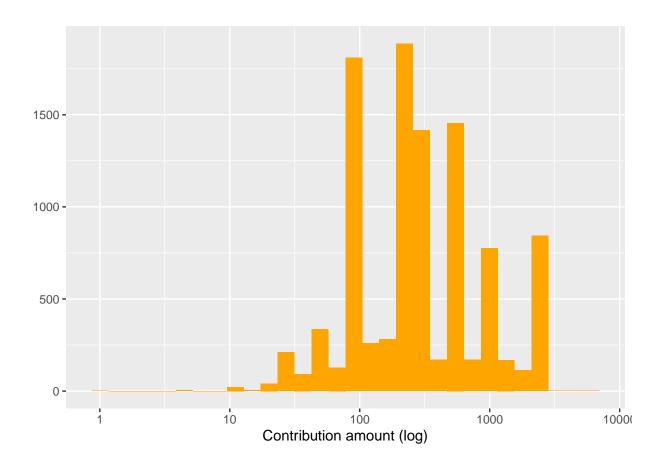


mayo1 <- mayoral2014 |> filter(cont_amount > 10000) |> select(cont_amount, relationship_to_candidate)
mayo1

```
## # A tibble: 8 x 2
     cont_amount relationship_to_candidate
##
##
           <dbl> <chr>
## 1
         508225. Candidate
## 2
          50000 Candidate
## 3
          20000 Candidate
## 4
          50000
                 Candidate
## 5
          50000 Candidate
## 6
          78805. Candidate
## 7
          12210 Candidate
## 8
          23624. Candidate
```

After removing the ouliers, we will have the following distribution for the contribution amounts:

```
mayo2 <- mayoral2014 |> filter(cont_amount <10000)
mayo2 |> ggplot(aes(x=cont_amount))+geom_histogram(fill="Orange")+labs(x="Contribution amount (log)",y=
```



• (6) Top five candidates in total contributions:

```
mayoral2014 |> group_by(candidate) |> summarise(total=sum(cont_amount)) |> arrange(desc(total)) |> slice
```

```
## # A tibble: 5 x 2
## candidate total
## 
## 1 Tory, John 2767869.
## 1 Tory, Olivia 1638266.
## 3 Ford, Doug 889897.
## 4 Ford, Rob 387648.
## 5 Stintz, Karen 242805
```

Top five candidates in mean contribution:

mayoral2014 |> group_by(candidate) |> summarise(mean=mean(cont_amount)) |> arrange(desc(mean)) |> slice

```
## # A tibble: 5 x 2
## candidate mean
## cchr> cdbl>
## 1 Sniedzins, Erwin 2025
## 2 Syed, Hïmy 2018
## 3 Ritch, Carlie 1887.
## 4 Ford, Doug 1456.
## 5 Clarke, Kevin 1200
```

Top five candidates in number of contributions:

##

<chr>

```
mayoral2014 |> group_by(candidate) |> summarise(cand_number=n()) |> arrange(-cand_number) |> slice(1:5
## # A tibble: 5 x 2
##
     candidate
                     cand_number
##
     <chr>
                           <int>
## 1 Chow, Olivia
                            5708
## 2 Tory, John
                             2602
## 3 Ford, Doug
                             611
                             538
## 4 Ford, Rob
## 5 Soknacki, David
                             314
  • (7) Removing contributions from the candidates themselves we will have the following results:
mayo2014_no_cand <- mayoral2014 |> filter(contributors_name!= candidate)
Top five candidates in total contributions:
mayo2014_no_cand |> group_by(candidate) |> summarise(total=sum(cont_amount)) |> arrange(desc(total)) |
## # A tibble: 5 x 2
##
    candidate
                      total
##
     <chr>>
                      <dbl>
## 1 Tory, John
                   2765369.
## 2 Chow, Olivia 1634766.
## 3 Ford, Doug
                    331173.
## 4 Stintz, Karen 242805
## 5 Ford, Rob
                    174510.
Top five candidates in mean contribution:
mayo2014_no_cand |> group_by(candidate) |> summarise(mean=mean(cont_amount)) |> arrange(desc(mean)) |>
## # A tibble: 5 x 2
##
     candidate
                        mean
##
     <chr>
                       <dbl>
## 1 Ritch, Carlie
                       1887.
## 2 Sniedzins, Erwin 1867.
## 3 Tory, John
                       1063.
## 4 Gardner, Norman
                       1000
## 5 Tiwari, Ramnarine 1000
Top five candidates in number of contributions:
mayo2014_no_cand |> group_by(candidate) |> summarise(cand_number=n()) |> arrange(-cand_number) |> slic
## # A tibble: 5 x 2
     candidate
                     cand_number
```

<int>

```
## 1 Chow, Olivia 5706
## 2 Tory, John 2601
## 3 Ford, Doug 608
## 4 Ford, Rob 531
## 5 Soknacki, David 314
```

• (8) 184 contributors gave money to more than one candidate.

```
mayoral2014 |> group_by(contributors_name) |> distinct(contributors_name, candidate) |> summarise(num_c
## [1] 184
```