Recast: Technical Exercise

Taiwo Owoseni

29/12/2022

Instructions

Clean and join the two datasets so that there is 1 column for each variable (channels and revenue) and 1 row for each date.

- a. Please make note of any concerns you have with the data (ex. missing data, potential data errors etc.)
- b. Export this to a CSV file

Exercise

- 1. Provide answers to the below questions with visualizations. Note: there may be numerous ways to interpret the questions below and therefore there are not necessarily "correct" answers to some of these questions.
 - a. Which channel had the most spend in 2022?
 - b. Which channel had the largest increase in spend so far in 2022 compared to the same date range in 2021?
 - c. Did Acme spend more with Google or Facebook in 2022? How has this changed since 2021?
 - d. Which retailer (DTC, Amazon or Walmart) accounted for the most revenue in October 2022?
 - e. In terms of total revenue, are there any anomalous days?
 - f. In which month of the year does Acme tend make the most revenue?
 - g. Does Acme's marketing spend tend to follow a similar pattern to revenue?

Import Libraries

library(tidyverse)

```
## -- Attaching packages -
                                                        ----- tidyverse 1.3.1 --
## v ggplot2 3.4.0
                       v purrr
                                 0.3.4
## v tibble 3.1.8
                                 1.0.9
                       v dplyr
## v tidyr
             1.2.0
                       v stringr 1.4.0
## v readr
             2.0.2
                       v forcats 0.5.1
## Warning: package 'ggplot2' was built under R version 4.1.2
## Warning: package 'tibble' was built under R version 4.1.2
## Warning: package 'tidyr' was built under R version 4.1.2
## Warning: package 'dplyr' was built under R version 4.1.2
```

```
## -- Conflicts -----
                                            -----ctidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                     masks stats::lag()
library(reshape2)
## Attaching package: 'reshape2'
## The following object is masked from 'package:tidyr':
##
       smiths
library(ggplot2)
library(tidyverse)
library(scales)
## Warning: package 'scales' was built under R version 4.1.2
##
## Attaching package: 'scales'
## The following object is masked from 'package:purrr':
##
##
       discard
## The following object is masked from 'package:readr':
##
##
       col_factor
library(lubridate)
##
## Attaching package: 'lubridate'
## The following objects are masked from 'package:base':
##
       date, intersect, setdiff, union
Reading the Data sets
acm.spend <- read_csv('acme_spend.csv') # read data</pre>
## New names:Rows: 10350 Columns: 4-- Column specification -----
## Delimiter: ","
## chr (2): date, channel
## dbl (2): ...1, spend
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
acm.rev <- read csv('acme revenue.csv') # read data</pre>
## New names:Rows: 1035 Columns: 5-- Column specification ------
## Delimiter: ","
## chr (1): date
## dbl (4): ...1, revenue_dtc, revenue_amazon, revenue_walmart
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
head(acm.spend)
## # A tibble: 6 x 4
     ...1 date channel
                                           spend
     <dbl> <chr> <chr>
                                           <dbl>
## 1
         1 1/1/20 facebook_prospecting
                                           4154.
## 2
         2 1/1/20 facebook_retargeting
                                           2679.
## 3
         3 1/1/20 google_branded_search
                                            474
## 4
         4 1/1/20 google_nonbranded_search 3817.
         5 1/1/20 pinterest
## 5
                                           7421.
## 6
         6 1/1/20 twitter
                                           2233.
head(acm.rev) # first 5 data points
## # A tibble: 6 x 5
      ...1 date revenue_dtc revenue_amazon revenue_walmart
##
##
     <dbl> <chr>
                        <dbl>
                                      <dbl>
                                                       <dbl>
                                      50000
## 1
       1 1/1/20
                       16000
                                                      34000
## 2
        2 1/2/20
                       19306.
                                      60332
                                                      41026.
## 3
         3 1/3/20
                       22052.
                                      68914.
                                                       46861.
## 4
         4 1/4/20
                       23177.
                                      72428.
                                                      49251.
         5 1/5/20
## 5
                       26169.
                                      81778.
                                                      55609.
## 6
         6 1/6/20
                       29430.
                                      91969.
                                                       62539.
dim(acm.rev) # data dimension
## [1] 1035
dim(acm.spend) # data dimension
## [1] 10350
                 4
summary(acm.spend) # basic descriptive details
                                         channel
         ...1
                        date
                                                               spend
## Min.
         :
                1
                    Length: 10350
                                       Length: 10350
                                                           Min.
                                                                :
## 1st Qu.: 2588
                    Class : character
                                       Class :character
                                                           1st Qu.: 1323
## Median : 5176
                   Mode :character
                                       Mode :character
                                                           Median: 5358
## Mean
         : 5176
                                                           Mean
                                                                : 7792
## 3rd Qu.: 7763
                                                           3rd Qu.:11711
## Max. :10350
                                                                  :36401
                                                           Max.
##
                                                           NA's
                                                                  :69
Display Missing values in Revenue Data
null.rev<- acm.rev%>%filter_all(any_vars(is.na(.))) # find empty entries
null.rev
## # A tibble: 4 x 5
##
      ...1 date
                    revenue_dtc revenue_amazon revenue_walmart
     <dbl> <chr>
                          <dbl>
                                         <dbl>
                                                         <dbl>
## 1
       18 1/18/20
                            NA
                                       163546.
                                                        111211.
## 2
     213 7/31/20
                         35993.
                                                        76486.
                                           NΑ
## 3 1012 10/8/22
                         58158.
                                       181745.
                                                            NA
## 4 1021 10/17/22
                            NA
                                           NΑ
                                                       136361.
Drop missing Values
```

```
acm.rev<- acm.rev |>
          select(-c(...1)) |> # drop column `...1`
         na.omit() # drop nan values
acm.spend<- acm.spend|>
           select(-c(...1)) > # drop column `...1`
          na.omit() # drop nan values
acm.rev
## # A tibble: 1,031 x 4
             revenue dtc revenue amazon revenue walmart
      date
##
      <chr>
                   <dbl>
                                  <dbl>
                                                  <dbl>
  1 1/1/20
                   16000
                                  50000
                                                  34000
## 2 1/2/20
                   19306.
                                  60332
                                                  41026.
## 3 1/3/20
                  22052.
                                  68914.
                                                  46861.
## 4 1/4/20
                                 72428.
                                                  49251.
                  23177.
## 5 1/5/20
                  26169.
                                 81778.
                                                  55609.
## 6 1/6/20
                  29430.
                                 91969.
                                                  62539.
## 7 1/7/20
                  32550.
                                 101720.
                                                  69170.
## 8 1/8/20
                  34248.
                                 107026.
                                                  72778.
## 9 1/9/20
                  36125.
                                 112892.
                                                  76766.
## 10 1/10/20
                  38360.
                                                  81515.
                                 119875.
## # ... with 1,021 more rows
summary(acm.rev)
                       revenue_dtc
        date
                                       revenue_amazon
                                                        revenue walmart
##
  Length:1031
                            : 16000
                                       Min. : 50000
                                                        Min.
                                                               : 34000
                       Min.
   Class : character
                       1st Qu.: 41717
                                       1st Qu.:130364
                                                        1st Qu.: 88648
                       Median : 72252
## Mode :character
                                       Median :225787
                                                        Median :153535
##
                       Mean
                            : 72932
                                       Mean
                                             :227608
                                                        Mean
                                                               :154773
                       3rd Qu.: 97568
##
                                        3rd Qu.:304187
                                                         3rd Qu.:206847
##
                       Max.
                              :193005
                                               :415952
                                                        Max.
                                                                :282848
                                       Max.
# convert channel to a factor
acm.spend$channel<-as.factor(acm.spend$channel) # change datatype to factor
acm.spend$date <- as.Date(acm.spend$date, "%m/%d/%y") # change datatype to date
acm.rev$date <-as.Date(acm.rev$date, "%m/%d/%y") # change datatype to date
# reshape data
acm.spend.wide <- pivot_wider(acm.spend, names_from = "channel", values_from = "spend")
#check for null values
acm.spend.wide%>% filter_all(any_vars(is.na(.)))
## # A tibble: 69 x 11
                facebook_~1 faceb~2 googl~3 googl~4 pinte~5 twitter tiktok linea~6
##
     date
##
                                      <dbl>
                                              <dbl>
                                                       <dbl>
                                                               <dbl> <dbl>
      <date>
                       <dbl>
                               <dbl>
                                                                              <dbl>
                                              6224.
##
   1 2022-08-24
                       9612.
                               4678.
                                         460
                                                         NA
                                                               2514.
                                                                       737.
                                                                              7501.
## 2 2022-08-25
                       8870.
                              2740.
                                         445
                                              6550.
                                                         NA
                                                               2459.
                                                                       940.
                                                                              6531.
## 3 2022-08-26
                       9623.
                               3028.
                                        507
                                              6371.
                                                         NΑ
                                                               2833. 1353.
                                                                              5691.
                                                               2283.
## 4 2022-08-27
                       7071.
                               4144.
                                        443
                                              5140.
                                                         NA
                                                                     1314.
                                                                              4686.
##
  5 2022-08-28
                      11160.
                               2666.
                                        485
                                              4421.
                                                         NA
                                                              1729. 1067.
                                                                              7671.
                                              5074.
## 6 2022-08-29
                      10876.
                               4373.
                                        598
                                                         NA
                                                              3154.
                                                                       710.
                                                                              5185.
## 7 2022-08-30
                      9756.
                              3334.
                                        537
                                              3572.
                                                              2995.
                                                                       800.
                                                                              6440.
                                                         NA
```

```
## 8 2022-08-31
                       9625.
                                3312.
                                          414
                                                4999.
                                                            NA
                                                                 1628.
                                                                        1390.
                                                                                5201.
## 9 2022-09-01
                       9509.
                                4550.
                                          577
                                                3292.
                                                           NΑ
                                                                 2744.
                                                                         837.
                                                                                3767.
                                3918.
                                                                 1852.
## 10 2022-09-02
                       7431.
                                          409
                                                4993.
                                                           NA
                                                                         954.
                                                                                6615.
## # ... with 59 more rows, 2 more variables: online_display <dbl>,
       online_video <dbl>, and abbreviated variable names 1: facebook_prospecting,
       2: facebook_retargeting, 3: google_branded_search,
       4: google nonbranded search, 5: pinterest, 6: linear tv
```

Joining the data sets

```
# left join by date
df<- left_join(acm.rev, acm.spend.wide, by="date")</pre>
## # A tibble: 1,031 x 14
##
      date
                 revenue_~1 reven~2 reven~3 faceb~4 faceb~5 googl~6 googl~7 pinte~8
##
      <date>
                      <dbl>
                               <dbl>
                                       <dbl>
                                               <dbl>
                                                        <dbl>
                                                                <dbl>
                                                                        <dbl>
   1 2020-01-01
                                                        2679.
                                                                  474
                                                                        3817.
                                                                                7421.
##
                     16000
                              50000
                                      34000
                                               4154.
    2 2020-01-02
                     19306.
                              60332
                                      41026.
                                               9165.
                                                        3009.
                                                                  505
                                                                        2958.
                                                                                5605.
##
##
                                                                        5388.
    3 2020-01-03
                     22052.
                             68914.
                                      46861.
                                               4383.
                                                       2511.
                                                                  483
                                                                               10587.
   4 2020-01-04
                     23177.
                             72428.
                                      49251.
                                               9311.
                                                       3824.
                                                                  528
                                                                        3792.
                                                                               10376.
   5 2020-01-05
                     26169. 81778.
                                      55609.
                                               8487.
                                                       3873.
                                                                  462
                                                                        4053.
                                                                                9356.
##
    6 2020-01-06
                     29430. 91969.
                                               7050.
                                                                        5092.
                                                                                7033.
                                     62539.
                                                       4469.
                                                                  436
                     32550. 101720.
                                     69170.
                                               9949.
##
  7 2020-01-07
                                                       2376.
                                                                  552
                                                                        6218. 11112.
   8 2020-01-08
                     34248. 107026.
                                     72778.
                                              10412.
                                                       3266.
                                                                  469
                                                                        5705.
                                                                               13820.
                     36125. 112892.
##
   9 2020-01-09
                                      76766.
                                              10313.
                                                        4227.
                                                                  577
                                                                        3639. 10056.
## 10 2020-01-10
                     38360. 119875. 81515.
                                               8833.
                                                        4738.
                                                                  569
                                                                        4400.
                                                                                9861.
## # ... with 1,021 more rows, 5 more variables: twitter <dbl>, tiktok <dbl>,
       linear_tv <dbl>, online_display <dbl>, online_video <dbl>, and abbreviated
## #
       variable names 1: revenue_dtc, 2: revenue_amazon, 3: revenue_walmart,
## #
       4: facebook_prospecting, 5: facebook_retargeting, 6: google_branded_search,
       7: google_nonbranded_search, 8: pinterest
```

summary(df)

```
##
                          revenue_dtc
                                                            revenue_walmart
         date
                                          revenue_amazon
           :2020-01-01
                                : 16000
                                                 : 50000
                                                                   : 34000
                                          Min.
   1st Qu.:2020-09-16
                         1st Qu.: 41717
                                          1st Qu.:130364
                                                            1st Qu.: 88648
##
   Median :2021-06-01
                         Median : 72252
                                          Median :225787
                                                            Median :153535
   Mean
           :2021-05-31
                         Mean
                               : 72932
                                                 :227608
                                                            Mean
                                          Mean
                                                                   :154773
                         3rd Qu.: 97568
   3rd Qu.:2022-02-13
                                          3rd Qu.:304187
                                                            3rd Qu.:206847
   Max.
           :2022-10-31
                         Max.
                                :193005
                                                  :415952
##
                                          Max.
                                                            Max.
                                                                   :282848
##
##
   facebook_prospecting facebook_retargeting google_branded_search
##
   Min.
          : 3215
                         Min.
                               : 1108
                                              Min.
                                                      :400.0
                         1st Qu.: 4315
##
   1st Qu.:10941
                                               1st Qu.:451.0
##
  Median :16268
                         Median: 6218
                                              Median :498.0
##
  Mean
          :16976
                         Mean : 6550
                                              Mean
                                                      :500.0
##
   3rd Qu.:21804
                         3rd Qu.: 8588
                                               3rd Qu.:550.5
##
   Max.
           :33854
                         Max.
                                :13286
                                               Max.
                                                      :600.0
##
   google_nonbranded_search pinterest
                                                                   tiktok
                                                 twitter
                                   : 3094
          : 1510
                             Min.
                                                     : 822.1
                                                                      : 366.9
  Min.
                                             Min.
                                                               Min.
```

```
1st Qu.: 5772
                             1st Qu.:11734
                                             1st Qu.:2888.8
                                                               1st Qu.:1312.8
  Median : 8447
                             Median :17713
                                             Median :4007.4
##
                                                               Median: 1897.5
                                    :18178
                                                    :4248.2
  Mean : 8851
                             Mean
                                             Mean
                                                               Mean
                                                                      :1974.0
                             3rd Qu.:23214
                                             3rd Qu.:5444.5
                                                               3rd Qu.:2596.9
##
   3rd Qu.:11433
##
   Max.
           :17819
                             Max.
                                    :35530
                                             Max.
                                                     :8619.3
                                                               Max.
                                                                      :3923.1
##
                             NA's
                                     :67
      linear_tv
##
                    online display
                                      online video
                    Min. : 204.3
##
   Min. :
                1
                                     Min.
                                            :
##
   1st Qu.: 6834
                    1st Qu.: 683.0
                                     1st Qu.:
##
  Median: 9903
                    Median: 987.9
                                     Median: 8982
## Mean
          :10309
                    Mean
                          :1040.8
                                     Mean
                                             :10071
                                     3rd Qu.:17798
##
   3rd Qu.:13333
                    3rd Qu.:1357.5
                                     Max.
## Max.
           :20950
                    Max.
                           :2118.5
                                             :36401
##
null.data <- df%>% filter_all(any_vars(is.na(.)))
null.data
## # A tibble: 67 x 14
##
      date
                 revenue_~1 reven~2 reven~3 faceb~4 faceb~5 googl~6 googl~7 pinte~8
##
      <date>
                      <dbl>
                              <dbl>
                                       <dbl>
                                               <dbl>
                                                       <dbl>
                                                               <dbl>
                                                                       <dbl>
                                                                               <dbl>
##
   1 2022-08-24
                     35354. 110480.
                                     75126.
                                               9612.
                                                       4678.
                                                                 460
                                                                       6224.
                                                                                  NA
   2 2022-08-25
                     35012. 109414.
                                     74401.
                                               8870.
                                                       2740.
##
                                                                 445
                                                                       6550.
                                                                                  NA
                     35841. 112004.
##
   3 2022-08-26
                                     76163.
                                              9623.
                                                       3028.
                                                                 507
                                                                       6371.
                                                                                  NA
## 4 2022-08-27
                     37231. 116346. 79115.
                                                                 443
                                                                                  NA
                                              7071.
                                                       4144.
                                                                       5140.
## 5 2022-08-28
                     36326. 113520. 77193.
                                             11160.
                                                       2666.
                                                                 485
                                                                       4421.
                                                                                  NA
## 6 2022-08-29
                     36025. 112578. 76553.
                                             10876.
                                                                 598
                                                                                  NA
                                                       4373.
                                                                       5074.
   7 2022-08-30
                     36789. 114966.
                                     78177.
                                              9756.
                                                                 537
                                                                                  NA
##
                                                       3334.
                                                                       3572.
## 8 2022-08-31
                     38359. 119873. 81513.
                                              9625.
                                                       3312.
                                                                 414
                                                                       4999.
                                                                                  NΑ
## 9 2022-09-01
                     39449. 123279. 83830.
                                               9509.
                                                       4550.
                                                                 577
                                                                       3292.
                                                                                  NA
## 10 2022-09-02
                     39289. 122779. 83490.
                                               7431.
                                                       3918.
                                                                 409
                                                                       4993.
                                                                                  NA
## # ... with 57 more rows, 5 more variables: twitter <dbl>, tiktok <dbl>,
       linear_tv <dbl>, online_display <dbl>, online_video <dbl>, and abbreviated
       variable names 1: revenue_dtc, 2: revenue_amazon, 3: revenue_walmart,
## #
       4: facebook_prospecting, 5: facebook_retargeting, 6: google_branded_search,
       7: google_nonbranded_search, 8: pinterest
# replace NAN with O
df <- replace(df, is.na(df), 0)</pre>
null.data <- df%>% filter_all(any_vars(is.na(.)))
null.data
## # A tibble: 0 x 14
## # ... with 14 variables: date <date>, revenue dtc <dbl>, revenue amazon <dbl>,
       revenue_walmart <dbl>, facebook_prospecting <dbl>,
       facebook_retargeting <dbl>, google_branded_search <dbl>,
## #
       google_nonbranded_search <dbl>, pinterest <dbl>, twitter <dbl>,
       tiktok <dbl>, linear_tv <dbl>, online_display <dbl>, online_video <dbl>
```

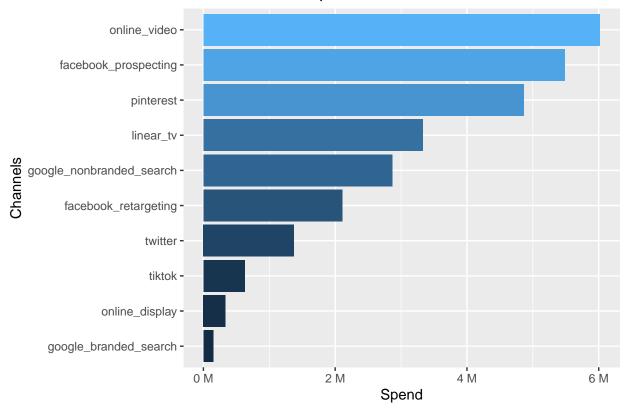
Which channel had the most spend in 2022

Observation: Acme spent about 6,000,000 on online videos in 2022

```
df$year<- as.factor(format(df$date, format="%Y")) # create year column as factor
df$month_no <- as.factor(format(df$date, format="%m")) # create month column as factor
df$month<- with(df, month.abb[month_no])</pre>
```

```
df|>
  filter(year == 2022)|> # filter on 2022
summarize_at(vars(facebook_prospecting:online_video), sum)|> # summ up channels
pivot_longer(cols = c("facebook_prospecting":"online_video"), # pvot the data longer
names_to = "channels", values_to="spend")|>
ggplot(aes( y= reorder(channels, spend), x=spend, fill=spend)) + # plot
theme(legend.position="none") +
scale_x_continuous(labels = unit_format(unit = "M", scale = 1e-6))+ # change the X scale
geom_bar(stat = "identity") + # bar plot identity bar
labs(title = "Channels Acme spent the most in 2022")+
xlab("Spend") +
ylab("Channels")
```

Channels Acme spent the most in 2022



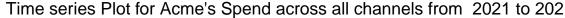
Which channel had the largest increase in spend so far in 2022 compared to the same date range in 2021?

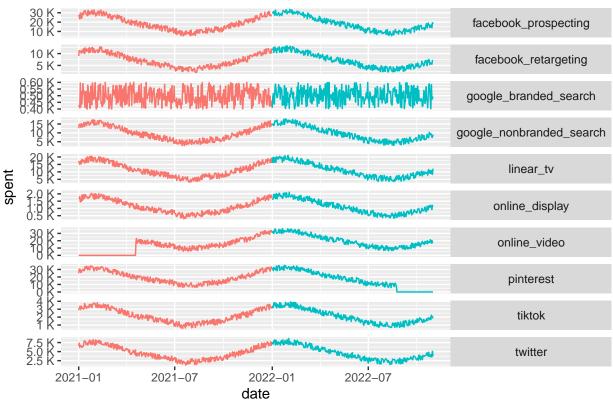
Observation: Online videos. From the plot, we can deduce that in the first quarter of 2021 there is no spending on online videos. However, in first quarter of 2022 it increased significantly. This is the highest increase in spending from 2021 to 2022.

```
channels<-names(df)[5:14]
colums <- c("date","year", channels)

monthly.channel <- df%>%
  filter(year %in% c(2021, 2022))|>
```

```
select(colums)
## Warning: Using an external vector in selections was deprecated in tidyselect
## 1.1.0.
## Warning: Please use `all_of()` or `any_of()` instead.
## Warning: # Was:
## Warning: data %>% select(colums)
## Warning:
## Warning: # Now:
## Warning: data %>% select(all_of(colums))
## Warning:
## Warning: See <a href="https://tidyselect.r-lib.org/reference/faq-external-vector.html">https://tidyselect.r-lib.org/reference/faq-external-vector.html</a>.
monthly.channel<- pivot_longer(monthly.channel,</pre>
                            cols = names(monthly.channel)[3:12],
                             names_to = "channels", values_to = "spent")
monthly.channel|>
  ggplot(aes(y = spent, x = date))+
  geom_line(aes(color = year))+
  theme(legend.position = "none") +
  labs(title = "Time series Plot for Acme's Spend across all channels from 2021 to 2022 ")+
  scale_y_continuous(labels = unit_format(unit = "K", scale = 1e-3) )+
  theme(strip.text.y = element_text(angle = 0))+
  facet_grid(channels~., scale = "free")
```



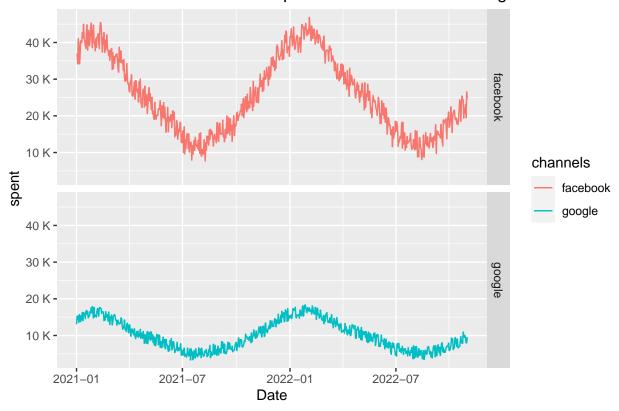


Did Acme spend more with Google or Facebook in 2022? How has this changed since 2021?

Observation: In 2022, Acme spent more with Facebook than Google. Additionally in 2021 and 2022, Acme spent over two times of google marketing on facebook marketing. Since the percentage spent on facebook is 72% and 28% in 2022 and 2021 respectively, then there is no change

```
ggle.fb.spend|>
  ggplot(aes(y = spent, x = date, color = channels))+
  labs(title = "Time series Plot for Acme's Spend on Facebook and Google from 2021 to 2022 ")+
  geom_line()+
  scale_y_continuous(labels = unit_format(unit = "K", scale = 1e-3))+
  facet_grid(channels ~.)+
  xlab("Date")
```

Time series Plot for Acme's Spend on Facebook and Google from 2021 to



```
summarise.gg.fb.spend<-ggle.fb.spend|>
group_by(year, channels)|>
summarise(total_spend = sum(spent))|>
mutate(percent = total_spend /sum(total_spend))
```

`summarise()` has grouped output by 'year'. You can override using the `.groups`
argument.

summarise.gg.fb.spend

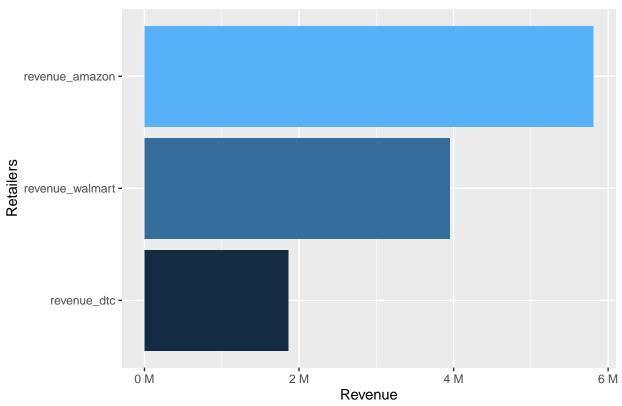
```
## # A tibble: 4 x 4
## # Groups:
              year [2]
    year channels total_spend percent
##
    <fct> <chr>
                         <dbl>
                               <dbl>
                                0.718
## 1 2021 facebook
                      9440333.
                      3712664. 0.282
## 2 2021 google
## 3 2022 facebook
                      7591534.
                                0.716
## 4 2022 google
                      3015926.
                                0.284
```

Which retailer (DTC, Amazon or Walmart) accounted for the most revenue in October 2022?

Observation: Acme generated about 6,000,000 in revenue on Amazon

```
df|>
  filter(month=="Oct" & year == "2022")|> # filter on month and year
  summarize_at(vars(revenue_dtc: revenue_walmart), sum)|> # sum up across the revenue
  pivot_longer(cols = c("revenue_dtc": "revenue_walmart"), # puvot table
  names_to = "retailers", values_to="revenue")|>
  ggplot(aes( y= reorder(retailers, revenue), x=revenue, fill=revenue)) +
  theme(legend.position="none") +
  scale_x_continuous(labels = unit_format(unit = "M", scale = 1e-6))+ # change the X scale
  geom_bar(stat = "identity") + # bar plot identity bar
  labs(title = "Renvenue from Acme's Retailers in 2022")+
  xlab("Revenue") +
  ylab("Retailers")
```

Renvenue from Acme's Retailers in 2022

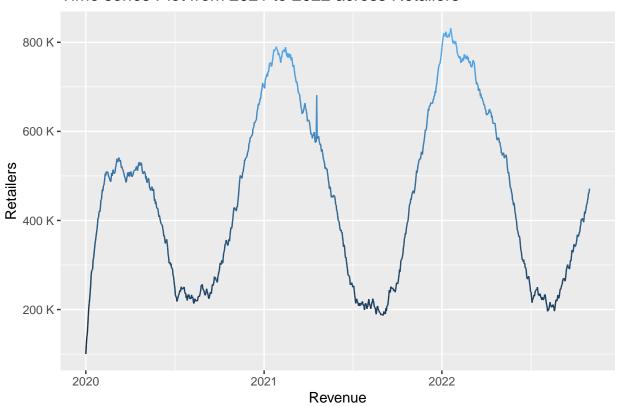


In terms of total revenue, are there any anomalous days?

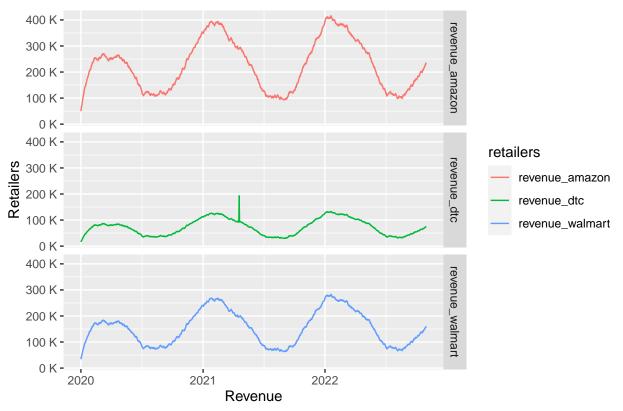
Observation: In terms of total revenue, graphically, In April 19th, 2021 anomaly is present in DTC's revenue. I will filter it out

```
total.rev<-
df|>
select(date, revenue_walmart, revenue_amazon, revenue_dtc)|>
mutate(total_rev = revenue_walmart +revenue_amazon +revenue_dtc)
```

Time series Plot from 2021 to 2022 across Retailers



Time series Plot from 2021 to 2022 across Retailers



```
rev.dtc.outliers <- boxplot(df$revenue_dtc, plot=FALSE)$out
df[df$revenue_dtc == rev.dtc.outliers, ]</pre>
```

```
## # A tibble: 1 x 17
## date revenue_dtc reven~1 reven~2 faceb~3 faceb~4 googl~5 googl~6 pinte~7
## <date> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> </dbl>
```

```
## 1 2021-04-19 193005. 290642. 197637. 18258. 7021. 451 9783. 20465.
## # ... with 8 more variables: twitter <dbl>, tiktok <dbl>, linear_tv <dbl>,
## # online_display <dbl>, online_video <dbl>, year <fct>, month_no <fct>,
## # month <chr>, and abbreviated variable names 1: revenue_amazon,
## # 2: revenue_walmart, 3: facebook_prospecting, 4: facebook_retargeting,
## # 5: google_branded_search, 6: google_nonbranded_search, 7: pinterest
df<- df[-which(df$revenue_dtc %in% rev.dtc.outliers),]</pre>
```

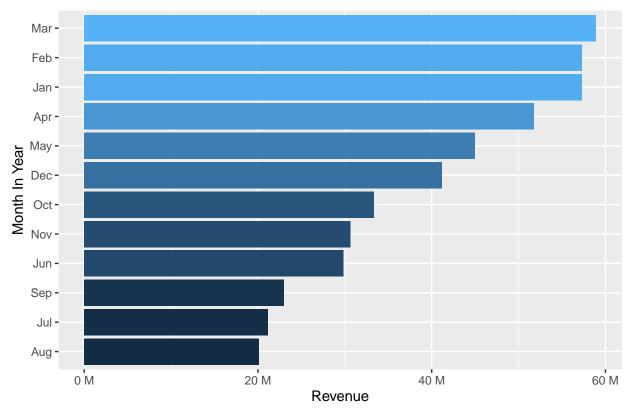
In which month of the year does Acme tend make the most revenue?

Observation: The total revenue for Acme In the month of March is the highest

```
monthly.rev <-longer.rev|>
  group_by(month)|>
  summarise(monthly_sum_revenue = sum(revenue))|>
  ggplot(aes( y= reorder(month, monthly_sum_revenue), x=monthly_sum_revenue, fill =monthly_sum_revenue
  theme(legend.position="none") +
  scale_x_continuous(labels = unit_format(unit = "M", scale = 1e-6))+ # change the X scale
  geom_bar(stat = "identity") + # bar plot identity bar
  labs(title = "Revenue Across all Months from 2020 to 2022")+
  xlab("Revenue") +
  ylab("Month In Year") +
  geom_bar(stat = 'identity')

monthly.rev
```

Revenue Across all Months from 2020 to 2022



Does Acme's marketing spend tend to follow a similar pattern to revenue?—

Graphically, the Acme's Marketing Spend and Retail revenue tend to follow similar pattern. However, this is not enough to confidently say they are correlated or there is a causal relationship between the two.

```
# total spend
# total revenuve
df$total_revenue <- rowSums(df[c(2:4)])</pre>
df$total_spend <- rowSums(df[c(5:14)])</pre>
total.spend.rev\leftarrow df[c(1,18,19)]
total.spend.rev
## # A tibble: 1,030 x 3
##
      date total_revenue total_spend
##
      <date>
                         <dbl>
                                     <dbl>
  1 2020-01-01
                       100000
                                    26297.
##
## 2 2020-01-02
                       120664
                                    27722.
## 3 2020-01-03
                       137828.
                                    32155.
## 4 2020-01-04
                       144856.
                                    37625.
## 5 2020-01-05
                       163555.
                                    35192.
## 6 2020-01-06
                                    35031.
                       183939.
## 7 2020-01-07
                       203440.
                                    41153.
## 8 2020-01-08
                       214052.
                                    44104.
## 9 2020-01-09
                       225783.
                                    39343.
## 10 2020-01-10
                       239750.
                                    39211.
## # ... with 1,020 more rows
total.spend.rev.long<-total.spend.rev|>
  pivot_longer(names_to = "category", cols = c('total_revenue', 'total_spend'), values_to= 'amount')
total.spend.rev.long|>
 ggplot(aes(y = amount, x = date, color = category))+
  geom_line()+
  labs(title = "Time series Plot for Acme's Spend and Revenue 2020 to 2022 ")+
  geom_smooth(method =lm, size = 0.7, se=FALSE)+
  scale_y_continuous(labels = unit_format(unit = "K", scale = 1e-3))
## Warning: Using `size` aesthetic for lines was deprecated in ggplot2 3.4.0.
## Warning: Please use `linewidth` instead.
## `geom_smooth()` using formula = 'y ~ x'
```



