## Final Q1 Analytics

## April 14, 2020

Consider only the rows with country\_id = "BDV" (there are 844 such rows). For each site\_id, we can compute the number of unique user\_id's found in these 844 rows. Which site\_id has the largest number of unique users? And what's the number?

```
[3]: import pandas as pd
      import numpy as np
      import matplotlib.pyplot as plt
 [4]: df=pd.read_csv("Adops & Data Scientist Sample Data - Q1 Analytics.csv")
 [5]:
     df
 [5]:
                              ts user_id country_id site_id
      0
            2019-02-01 00:01:24
                                  LC36FC
                                                 TL6
                                                       NOOTG
                                  LC39B6
      1
            2019-02-01 00:10:19
                                                 TL6
                                                       NOOTG
      2
            2019-02-01 00:21:50
                                  LC3500
                                                 TL6
                                                       NOOTG
      3
            2019-02-01 00:22:50
                                  LC374F
                                                 TL6
                                                       NOOTG
            2019-02-01 00:23:44
      4
                                  LCC1C3
                                                 TL6
                                                       QG03G
      3548
            2019-02-07 23:56:57
                                  LC3F13
                                                 TL6
                                                       QG03G
      3549
                                                 HVQ
                                                       3POLC
            2019-02-07 23:58:36
                                  LC3842
      3550
            2019-02-07 23:58:56
                                                 TL6
                                                       QG03G
                                  LC35EB
      3551
            2019-02-07 23:59:19
                                  LC3842
                                                 HVQ
                                                       3POLC
      3552
            2019-02-07 23:59:37
                                  LC3842
                                                 HVQ
                                                       3POLC
      [3553 rows x 4 columns]
 [6]: BDV=df[df["country_id"]=="BDV"]
[16]: BDV.groupby(['site_id']).nunique()
[16]:
                              country_id
                     user_id
                                          site_id
      site_id
      3POLC
                 5
                           2
                                        1
                                                 1
      5NPAU
               716
                         544
                                        1
                                                 1
      NOOTG
               122
                                        1
                          90
                                                 1
```

```
[17]: #groupby site id and count unique
#5NPAU and 544
BDV.groupby('site_id')['user_id'].nunique()
```

[17]: site\_id
 3POLC 2
 5NPAU 544
 NOOTG 90
 Name: user\_id, dtype: int64

Between 2019-02-03 00:00:00 and 2019-02-04 23:59:59, there are four users who visited a certain site more than 10 times. Find these four users & which sites they (each) visited more than 10 times. (Simply provides four triples in the form (user id, site id, number of visits) in the box below.)

```
[18]: #filter date four=df[(df["ts"]>="2019-02-03 00:00:00")&(df["ts"]<="2019-02-04 23:59:59")]
```

```
[19]: #groupby user and site id
sites=four.groupby(["user_id","site_id"]).count().reset_index()
```

```
[20]: #find users who visited site more than 10 times by ts count sites[sites['ts'] > 10]
```

```
[20]:
                                country_id
          user_id site_id
                            ts
           LC06C3
                     NOOTG
                            25
                                         25
      417 LC3A59
                     NOOTG
                            26
                                         26
      485 LC3C7E
                     3POLC
                            15
                                         15
      493 LC3C9D
                     NOOTG
                            17
                                         17
```

For each site, compute the unique number of users whose last visit (found in the original data set) was to that site. For instance, user "LC3561"'s last visit is to "N0OTG" based on timestamp data. Based on this measure, what are top three sites? (hint: site "3POLC" is ranked at 5th with 28 users whose last visit in the data set was to 3POLC; simply provide three pairs in the form (site\_id, number of users).)

```
[21]: df
```

```
[21]:
                              ts user_id country_id site_id
      0
            2019-02-01 00:01:24
                                 LC36FC
                                                TL6
                                                       NOOTG
      1
            2019-02-01 00:10:19
                                 LC39B6
                                                TL6
                                                       NOOTG
      2
            2019-02-01 00:21:50
                                 LC3500
                                                TL6
                                                       NOOTG
      3
            2019-02-01 00:22:50
                                                TL6
                                                       NOOTG
                                 LC374F
      4
            2019-02-01 00:23:44 LCC1C3
                                                TL6
                                                       QG03G
                                                •••
      3548
            2019-02-07 23:56:57 LC3F13
                                                TL6
                                                       QG03G
      3549
            2019-02-07 23:58:36
                                 LC3842
                                                HVQ
                                                       3POLC
            2019-02-07 23:58:56
                                                       QG03G
      3550
                                 LC35EB
                                                TL6
      3551 2019-02-07 23:59:19 LC3842
                                                HVQ
                                                       3POLC
```

```
3552 2019-02-07 23:59:37 LC3842
                                                   HVQ
                                                          3POLC
      [3553 rows x 4 columns]
[22]: #find last visit
      df_last=df.sort_values('ts').groupby('user_id').tail(1)
      df_last.groupby("site_id").nunique()
[22]:
                     user_id country_id site_id
      site_id
      3POLC
                 28
                           28
                                         5
                                                   1
                                         3
      5NPAU
                990
                          992
                                                   1
      EUZ/Q
                  1
                            1
                                         1
                                                   1
      GVOFK
                 42
                           42
                                         1
                                                   1
      JSUUP
                  1
                            1
                                         1
                                                   1
      NOOTG
                                         6
                                                   1
                561
                          561
      QG03G
                288
                          289
                                         1
                                                   1
      RT9Z6
                  2
                            2
                                         1
                                                   1
[23]:
      #top three sites are 5NPAU, NOOTG, OGO3G
[24]: df_last.groupby("site_id").nunique()
[24]:
                     user_id country_id site_id
                 ts
      site_id
      3POLC
                 28
                           28
                                         5
                                                   1
                                         3
      5NPAU
                990
                          992
                                                   1
      EUZ/Q
                  1
                            1
                                         1
                                                   1
      GVOFK
                 42
                           42
                                         1
                                                   1
      JSUUP
                  1
                            1
                                         1
                                                   1
                                         6
      NOOTG
                561
                          561
                                                   1
      QG03G
                288
                          289
                                         1
                                                   1
      RT9Z6
                  2
                            2
                                         1
                                                   1
```

For each user, determine the first site he/she visited and the last site he/she visited based on the timestamp data. Compute the number of users whose first/last visits are to the same website. What is the number?

## 1 Considering users that have more than 1 time stamp

```
[56]: count2=df.groupby("user_id").count()['ts'].reset_index()
      filtered=count2[count2['ts']>1]["user_id"]
      twotimestamps=df[df['user_id'].isin(list(filtered))]
[61]: two_time_first=twotimestamps.sort_values('ts').groupby('user_id').head(1)
      df first
[61]:
                          ts user_id country_id site_id
      0 2019-02-01 00:01:24 LC36FC
                                            TL6
                                                  NOOTG
[62]: two time last=twotimestamps.sort values('ts').groupby('user id').tail(1)
      two time last
[62]:
                             ts user_id country_id site_id
      28
           2019-02-01 02:36:51 LC3DAD
                                               TL6
                                                     NOOTG
      39
           2019-02-01 03:16:24 LC37EA
                                               TL6
                                                     QG03G
      68
           2019-02-01 04:45:22 LC305A
                                               TL6
                                                     3POLC
      150
           2019-02-01 11:51:08 LC3222
                                               TL6
                                                     QG03G
      163
           2019-02-01 12:06:39 LC8C37
                                               QLT
                                                     5NPAU
                                               •••
      3538 2019-02-07 23:14:19 LC3780
                                                     QG03G
                                               TL6
                                                     QG03G
      3540 2019-02-07 23:30:43 LC33F8
                                               TL6
      3545 2019-02-07 23:44:34 LC3561
                                               TL6
                                                     NOOTG
      3547 2019-02-07 23:55:07 LC3837
                                               TL6
                                                     RT9Z6
      3552 2019-02-07 23:59:37 LC3842
                                               HVQ
                                                     3POLC
      [655 rows x 4 columns]
[63]: | join_two=pd.merge(two_time_first, two_time_last, on='user_id')
      join_two
[63]:
                          ts_x user_id country_id_x site_id_x
                                                                              ts_y \
           2019-02-01 00:01:24 LC36FC
                                                        NOOTG 2019-02-07 00:24:50
      0
                                                TL6
      1
           2019-02-01 00:22:50 LC374F
                                                TL6
                                                        NOOTG 2019-02-03 04:50:43
      2
           2019-02-01 00:24:21 LC3E1D
                                                HVQ
                                                        GVOFK 2019-02-04 12:26:52
      3
           2019-02-01 00:25:29 LC3561
                                                TL6
                                                        3POLC 2019-02-07 23:44:34
      4
                                                TL6
                                                        NOOTG 2019-02-02 18:06:55
          2019-02-01 00:29:15 LC3A01
      650 2019-02-07 19:05:16 LC342F
                                                QLT
                                                        5NPAU 2019-02-07 19:13:48
      651 2019-02-07 19:14:14 LCC3D7
                                                        5NPAU 2019-02-07 19:23:01
                                                QLT
      652 2019-02-07 19:23:29 LC362E
                                                QLT
                                                        5NPAU 2019-02-07 19:30:22
      653 2019-02-07 19:36:05 LC3D07
                                                TL6
                                                        NOOTG 2019-02-07 21:42:23
      654 2019-02-07 19:38:55 LC3557
                                                BDV
                                                        5NPAU 2019-02-07 22:19:25
          country_id_y site_id_y
      0
                  TL6
                           NOOTG
      1
                  TL6
                           NOOTG
```

```
2
                   QLT
                            5NPAU
      3
                   TL6
                            NOOTG
      4
                   TL6
                            NOOTG
      . .
      650
                   QLT
                            5NPAU
      651
                   QLT
                            5NPAU
      652
                   QLT
                            5NPAU
      653
                   BDV
                            5NPAU
                   QLT
      654
                            5NPAU
      [655 rows x 7 columns]
[66]: sum(join_two["site_id_x"]!=join_two["site_id_y"])
[66]: 246
[65]: sum(join_two["site_id_x"]==join_two["site_id_y"])
[65]: 409
```

## 2 Considering All Users

```
[25]: #first visits
      df_first=df.sort_values('ts').groupby('user_id').head(1)
      df_first
[25]:
                             ts user_id country_id site_id
            2019-02-01 00:01:24 LC36FC
                                               TL6
                                                     NOOTG
      1
            2019-02-01 00:10:19 LC39B6
                                               TL6
                                                     NOOTG
      2
            2019-02-01 00:21:50 LC3500
                                               TL6
                                                     NOOTG
      3
            2019-02-01 00:22:50 LC374F
                                                     NOOTG
                                               TL6
            2019-02-01 00:23:44 LCC1C3
                                               TL6
                                                     QG03G
      3542 2019-02-07 23:39:33 LC34C6
                                               HVQ
                                                     GVOFK
                                                     NOOTG
      3543 2019-02-07 23:41:25 LCC36A
                                               TL6
      3544 2019-02-07 23:42:35
                                LC34B8
                                               TL6
                                                     QG03G
      3548 2019-02-07 23:56:57
                                 LC3F13
                                               TL6
                                                     QG03G
      3550 2019-02-07 23:58:56 LC35EB
                                               TL6
                                                     QG03G
      [1916 rows x 4 columns]
[26]: #last visit
      df_last
```

```
[26]:
                             ts user_id country_id site_id
            2019-02-01 00:10:19
                                 LC39B6
                                                      NOOTG
      1
                                                TL6
      2
            2019-02-01 00:21:50
                                 LC3500
                                                TL6
                                                      NOOTG
      4
            2019-02-01 00:23:44 LCC1C3
                                                TL6
                                                      QG03G
            2019-02-01 00:41:50 LCC3C3
      11
                                                QLT
                                                      5NPAU
      12
            2019-02-01 00:42:13 LC39C8
                                                TL6
                                                      QG03G
      •••
                                                •••
      3545 2019-02-07 23:44:34 LC3561
                                                TL6
                                                      NOOTG
      3547 2019-02-07 23:55:07
                                 LC3837
                                                TL6
                                                      RT9Z6
      3548 2019-02-07 23:56:57
                                 LC3F13
                                                TL6
                                                      QG03G
      3550 2019-02-07 23:58:56 LC35EB
                                                TL6
                                                      QG03G
      3552 2019-02-07 23:59:37
                                 LC3842
                                                HVQ
                                                      3POLC
      [1916 rows x 4 columns]
[27]: #join
      join=pd.merge(df_last, df_first, on='user_id')
      join
[27]:
                           ts_x user_id country_id_x site_id_x
                                                                                 ts_y \
            2019-02-01 00:10:19 LC39B6
                                                  TL6
                                                          NOOTG
                                                                 2019-02-01 00:10:19
      0
      1
            2019-02-01 00:21:50 LC3500
                                                  TL6
                                                          NOOTG
                                                                 2019-02-01 00:21:50
      2
            2019-02-01 00:23:44
                                 LCC1C3
                                                  TL6
                                                          QGO3G
                                                                 2019-02-01 00:23:44
            2019-02-01 00:41:50
                                 LCC3C3
                                                  QLT
                                                          5NPAU
                                                                 2019-02-01 00:41:50
      4
            2019-02-01 00:42:13 LC39C8
                                                  TL6
                                                          QGO3G
                                                                 2019-02-01 00:42:13
      1911 2019-02-07 23:44:34 LC3561
                                                  TL6
                                                          NOOTG
                                                                 2019-02-01 00:25:29
                                                  TL6
      1912 2019-02-07 23:55:07
                                 LC3837
                                                          RT9Z6
                                                                 2019-02-03 03:30:25
      1913 2019-02-07 23:56:57
                                 LC3F13
                                                  TL6
                                                          QG03G
                                                                 2019-02-07 23:56:57
      1914 2019-02-07 23:58:56
                                 LC35EB
                                                  TL6
                                                          QG03G
                                                                 2019-02-07 23:58:56
      1915 2019-02-07 23:59:37
                                                  HVQ
                                                          3POLC
                                                                 2019-02-05 16:21:30
                                LC3842
           country_id_y site_id_y
      0
                    TL6
                            NOOTG
      1
                    TL6
                            NOOTG
      2
                    TL6
                            QG03G
      3
                    QLT
                            5NPAU
      4
                    TL6
                            QG03G
      1911
                    TL6
                            3POLC
                            5NPAU
      1912
                    QLT
      1913
                    TL6
                            QG03G
      1914
                    TL6
                            QG03G
      1915
                    DVH
                            3POLC
```

[1916 rows x 7 columns]

```
[28]: sum(join["site_id_x"]!=join["site_id_y"])
[28]: 246
[32]: sum(join["site id x"]==join["site id y"])
[32]: 1670
[29]: test = join.drop_duplicates(subset=['user_id'], keep=False)
[33]: test
[33]:
                           ts_x user_id country_id_x site_id_x
                                                                                ts_y \
            2019-02-01 00:10:19 LC39B6
                                                 TL6
                                                          NOOTG
                                                                 2019-02-01 00:10:19
      0
      1
            2019-02-01 00:21:50 LC3500
                                                 TL6
                                                          NOOTG
                                                                 2019-02-01 00:21:50
      2
            2019-02-01 00:23:44 LCC1C3
                                                 TL6
                                                          QGO3G
                                                                 2019-02-01 00:23:44
      3
            2019-02-01 00:41:50 LCC3C3
                                                 QLT
                                                          5NPAU
                                                                 2019-02-01 00:41:50
                                                          QG03G
            2019-02-01 00:42:13 LC39C8
                                                 TL6
                                                                 2019-02-01 00:42:13
      1911 2019-02-07 23:44:34 LC3561
                                                 TL6
                                                          NOOTG
                                                                 2019-02-01 00:25:29
                                                 TL6
      1912 2019-02-07 23:55:07
                                LC3837
                                                          RT9Z6
                                                                 2019-02-03 03:30:25
      1913 2019-02-07 23:56:57
                                 LC3F13
                                                 TL6
                                                          QGO3G
                                                                 2019-02-07 23:56:57
      1914 2019-02-07 23:58:56 LC35EB
                                                 TL6
                                                                 2019-02-07 23:58:56
                                                          QG03G
      1915 2019-02-07 23:59:37 LC3842
                                                 HVQ
                                                          3POLC
                                                                 2019-02-05 16:21:30
           country_id_y site_id_y
      0
                    TL6
                            NOOTG
      1
                    TL6
                            NOOTG
      2
                    TL6
                            QG03G
      3
                    QLT
                            5NPAU
                            QG03G
      4
                    TL6
                    TL6
                            3POLC
      1911
                            5NPAU
      1912
                    QLT
      1913
                    TL6
                            QG03G
      1914
                            QG03G
                    TL6
      1915
                    HVQ
                            3POLC
      [1916 rows x 7 columns]
 []: ##1670 users went to same first and last website
```