Data Cleansing

February 17, 2025

1 Data Cleansing

```
[76]: import pandas as pd
     1.0.1 Read File
[77]: df = pd.read_excel(r'D:\Analyst materials\Python\Customer Call List.xlsx')
[77]:
           CustomerID First_Name
                                      Last_Name
                                                  Phone_Number
                 1001
                                                  123-545-5421
      0
                            Frodo
                                        Baggins
      1
                 1002
                             Abed
                                           Nadir
                                                  123/643/9775
      2
                 1003
                           Walter
                                          /White
                                                     7066950392
      3
                 1004
                           Dwight
                                         Schrute
                                                  123-543-2345
      4
                 1005
                               Jon
                                            Snow
                                                  876 | 678 | 3469
      5
                 1006
                                                  304-762-2467
                              Ron
                                         Swanson
      6
                 1007
                              Jeff
                                          Winger
                                                             NaN
      7
                 1008
                         Sherlock
                                          Holmes
                                                  876 | 678 | 3469
                 1009
                          Gandalf
      8
                                             NaN
                                                            N/a
      9
                 1010
                            Peter
                                         Parker
                                                  123-545-5421
      10
                 1011
                          Samwise
                                          Gamgee
                                                            NaN
                 1012
                                      ...Potter
                                                  7066950392
      11
                            Harry
      12
                 1013
                              Don
                                          Draper
                                                  123-543-2345
      13
                 1014
                           Leslie
                                           Knope
                                                  876 | 678 | 3469
      14
                 1015
                                    Flenderson_
                                                  304-762-2467
                             Toby
      15
                 1016
                              Ron
                                         Weasley
                                                  123-545-5421
      16
                 1017
                         Michael
                                           Scott
                                                  123/643/9775
      17
                                                     7066950392
                 1018
                            Clark
                                            Kent
      18
                 1019
                            Creed
                                                            N/a
                                          Braton
      19
                 1020
                           Anakin
                                      Skywalker
                                                  876 | 678 | 3469
      20
                 1020
                           Anakin
                                      Skywalker
                                                  876 | 678 | 3469
                                            Address Paying Customer Do_Not_Contact
      0
                            123 Shire Lane, Shire
                                                                  Yes
                                                                                    No
      1
                               93 West Main Street
                                                                   No
                                                                                   Yes
      2
                                298 Drugs Driveway
                                                                    N
                                                                                   NaN
      3
           980 Paper Avenue, Pennsylvania, 18503
                                                                                     Y
                                                                  Yes
```

```
4
                          123 Dragons Road
                                                           Y
                                                                          No
5
                          768 City Parkway
                                                                         Yes
                                                         Yes
6
                         1209 South Street
                                                          No
                                                                          No
7
                              98 Clue Drive
                                                           N
                                                                          No
8
                          123 Middle Earth
                                                         Yes
                                                                         NaN
               25th Main Street, New York
9
                                                         Yes
                                                                          No
                                                                          No
10
                     612 Shire Lane, Shire
                                                         Yes
                      2394 Hogwarts Avenue
                                                           Y
11
                                                                         NaN
12
                          2039 Main Street
                                                         Yes
                                                                           N
13
                          343 City Parkway
                                                         Yes
                                                                          No
14
                              214 HR Avenue
                                                           N
                                                                          No
15
                      2395 Hogwarts Avenue
                                                          No
                                                                           N
16
           121 Paper Avenue, Pennsylvania
                                                         Yes
                                                                          No
17
                           3498 Super Lane
                                                           Y
                                                                         NaN
18
                                        N/a
                                                         N/a
                                                                         Yes
19
              910 Tatooine Road, Tatooine
                                                         Yes
                                                                           N
20
              910 Tatooine Road, Tatooine
                                                                           N
                                                         Yes
```

Not_Useful_Column 0 True False 1 2 True 3 True 4 True 5 True 6 False 7 False 8 False 9 True 10 True 11 True 12 False 13 False False 14 15 False 16 False 17 True 18 True

[78]: df.info()

19

20

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 21 entries, 0 to 20
Data columns (total 8 columns):

True

True

Column Non-Null Count Dtype

```
2
          Last_Name
                             20 non-null
                                             object
      3
          Phone_Number
                             19 non-null
                                             object
      4
          Address
                             21 non-null
                                             object
      5
          Paying Customer
                             21 non-null
                                             object
          Do Not Contact
                             17 non-null
                                             object
          Not_Useful_Column 21 non-null
                                             bool
     dtypes: bool(1), int64(1), object(6)
     memory usage: 1.3+ KB
     1.0.2 Check and Remove Duplicates
[79]: df[df.duplicated()]
[79]:
          CustomerID First_Name Last_Name Phone_Number \
                         Anakin Skywalker 876|678|3469
      20
                1020
                              Address Paying Customer Do_Not_Contact \
      20 910 Tatooine Road, Tatooine
                                                  Yes
          Not_Useful_Column
      20
                       True
[80]: df = df.drop_duplicates()
     1.0.3 Drop not useful column
[81]: df = df.drop(columns = 'Not_Useful_Column')
[81]:
         CustomerID First_Name Last_Name Phone_Number
                                                                       Address \
      0
               1001
                         Frodo
                                 Baggins 123-545-5421 123 Shire Lane, Shire
       Paying Customer Do_Not_Contact
      0
                    Yes
     1.0.4 Cleaning the Last Name column by removing extra characters
[82]: df['Last_Name'] = df['Last_Name'].str.strip("123._/")
      df[['Last_Name']]
[82]:
           Last_Name
      0
             Baggins
      1
               Nadir
      2
               White
      3
             Schrute
      4
                Snow
      5
             Swanson
```

0

1

CustomerID

First_Name

21 non-null

21 non-null

int64

object

```
6
        Winger
7
        Holmes
8
           NaN
9
        Parker
10
        Gamgee
11
        Potter
12
        Draper
13
         Knope
14
    Flenderson
15
       Weasley
16
         Scott
17
          Kent
18
        Braton
19
     Skywalker
```

1.0.5 Cleaning Phone Number column by first stripping all special characters using regex

```
[83]: df['Phone_Number'] = df['Phone_Number'].str.replace('[^A-Za-z0-9]', '', \under oregex=True)
df[['Phone_Number']]
```

```
[83]:
         Phone_Number
            1235455421
      0
      1
            1236439775
      2
                   NaN
      3
            1235432345
      4
           8766783469
      5
           3047622467
      6
                   NaN
      7
           8766783469
      8
                    Na
      9
            1235455421
      10
                   NaN
                   NaN
      11
      12
            1235432345
      13
           8766783469
      14
            3047622467
      15
            1235455421
      16
            1236439775
      17
                   NaN
      18
                    Na
      19
           8766783469
```

1.0.6 and then insert the new format back onto Phone Number

```
[84]: df['Phone_Number'] = df['Phone_Number'].apply(lambda x: str(x))
      df['Phone_Number'] = df['Phone_Number'].apply(lambda x: x[0:3] + '-' + x[3:6] +
       4 - 1 + x[6:10]
      df[['Phone_Number']]
[84]:
          Phone_Number
          123-545-5421
      0
      1
          123-643-9775
      2
                 nan--
      3
          123-543-2345
      4
          876-678-3469
          304-762-2467
      5
      6
                 nan--
      7
          876-678-3469
      8
                  Na--
      9
          123-545-5421
      10
                 nan--
      11
                 nan--
          123-543-2345
      12
      13
          876-678-3469
      14
          304-762-2467
      15
          123-545-5421
      16
          123-643-9775
      17
                 nan--
      18
                  Na--
      19
          876-678-3469
```

1.0.7 ...and then strip off extra characters on null values for later cleaning

```
[85]: df['Phone_Number'] = df['Phone_Number'].str.strip('--')
df[['Phone_Number']]
```

```
[85]:
          Phone_Number
      0
          123-545-5421
          123-643-9775
      1
      2
                    nan
      3
          123-543-2345
      4
          876-678-3469
      5
          304-762-2467
      6
                    nan
      7
          876-678-3469
      8
                     Na
      9
          123-545-5421
      10
                    nan
      11
                    nan
      12
          123-543-2345
```

```
13 876-678-3469
14 304-762-2467
15 123-545-5421
16 123-643-9775
17 nan
18 Na
19 876-678-3469
```

1.0.8 Clearing all null values

```
[86]: df = df.fillna('')
    df = df.replace('N/a', '')
    df = df.replace('nan', '')
    df = df.replace('Na', '')
    df
```

| [86]: | | ${\tt CustomerID}$ | First_Name | Last_Name | Phone_Number | \ |
|-------|----|--------------------|------------|------------|--------------|---|
| | 0 | 1001 | Frodo | Baggins | 123-545-5421 | |
| | 1 | 1002 | Abed | Nadir | 123-643-9775 | |
| | 2 | 1003 | Walter | White | | |
| | 3 | 1004 | Dwight | Schrute | 123-543-2345 | |
| | 4 | 1005 | Jon | Snow | 876-678-3469 | |
| | 5 | 1006 | Ron | Swanson | 304-762-2467 | |
| | 6 | 1007 | Jeff | Winger | | |
| | 7 | 1008 | Sherlock | Holmes | 876-678-3469 | |
| | 8 | 1009 | Gandalf | | | |
| | 9 | 1010 | Peter | Parker | 123-545-5421 | |
| | 10 | 1011 | Samwise | Gamgee | | |
| | 11 | 1012 | Harry | Potter | | |
| | 12 | 1013 | Don | Draper | 123-543-2345 | |
| | 13 | 1014 | Leslie | Knope | 876-678-3469 | |
| | 14 | 1015 | Toby | Flenderson | 304-762-2467 | |
| | 15 | 1016 | Ron | Weasley | 123-545-5421 | |
| | 16 | 1017 | Michael | Scott | 123-643-9775 | |
| | 17 | 1018 | Clark | Kent | | |
| | 18 | 1019 | Creed | Braton | | |
| | 19 | 1020 | Anakin | Skywalker | 876-678-3469 | |

Address Paying Customer Do_Not_Contact 0 123 Shire Lane, Shire Yes No 93 West Main Street 1 No Yes 2 298 Drugs Driveway N 3 980 Paper Avenue, Pennsylvania, 18503 Y Yes 4 123 Dragons Road Y No 5 768 City Parkway Yes Yes 6 1209 South Street No No 98 Clue Drive 7 N No

| 8 | 123 Middle Earth | Yes | |
|----|--------------------------------|-----|-----|
| 9 | 25th Main Street, New York | Yes | No |
| 10 | 612 Shire Lane, Shire | Yes | No |
| 11 | 2394 Hogwarts Avenue | Y | |
| 12 | 2039 Main Street | Yes | N |
| 13 | 343 City Parkway | Yes | No |
| 14 | 214 HR Avenue | N | No |
| 15 | 2395 Hogwarts Avenue | No | N |
| 16 | 121 Paper Avenue, Pennsylvania | Yes | No |
| 17 | 3498 Super Lane | Y | |
| 18 | | | Yes |
| 19 | 910 Tatooine Road, Tatooine | Yes | N |

1.0.9 Splitting the Address into 3 columns for more detailed view

```
[87]: df[['Street_Address', 'State', 'Zip_Code']] = df['Address'].str.split(',', n=2,⊔

→expand=True)
df[['Address', 'Street_Address', 'State', 'Zip_Code']]
```

| | df[| ['Address', 'Street | _Address', | 'State', | 'Zip_Code']] | | |
|-----|-----|---------------------|------------|-----------|---------------|--------|---|
| 7]: | | | | Address | Street_A | ddress | \ |
| | 0 | 123 | 3 Shire La | ne, Shire | 123 Shir | | |
| | 1 | (| 93 West Ma | in Street | 93 West Main | Street | |
| | 2 | | 298 Drugs | Driveway | 298 Drugs Dr | iveway | |
| | 3 | 980 Paper Avenue, 1 | Pennsylvan | ia, 18503 | 980 Paper | Avenue | |
| | 4 | | 123 Dra | gons Road | 123 Dragon | s Road | |
| | 5 | | 768 Cit | y Parkway | 768 City P | arkway | |
| | 6 | | 1209 Sou | th Street | 1209 South | Street | |
| | 7 | | 98 C | lue Drive | 98 Clue | Drive | |
| | 8 | | 123 Mid | dle Earth | 123 Middle | Earth | |
| | 9 | 25th Ma: | in Street, | New York | 25th Main | Street | |
| | 10 | 612 | 2 Shire La | ne, Shire | 612 Shir | e Lane | |
| | 11 | 23 | 394 Hogwar | ts Avenue | 2394 Hogwarts | Avenue | |
| | 12 | | 2039 Ma | in Street | 2039 Main | Street | |
| | 13 | | 343 Cit | y Parkway | 343 City P | arkway | |
| | 14 | | 214 | HR Avenue | 214 HR | Avenue | |
| | 15 | 23 | 395 Hogwar | ts Avenue | 2395 Hogwarts | Avenue | |
| | 16 | 121 Paper A | venue, Pen | nsylvania | 121 Paper | Avenue | |
| | 17 | | 3498 S | uper Lane | 3498 Supe | r Lane | |
| | 18 | | | | | | |
| | 19 | 910 Tatoo | oine Road, | Tatooine | 910 Tatooin | e Road | |
| | | State Zip_0 | Code | | | | |
| | 0 | Shire I | None | | | | |
| | 1 | None I | None | | | | |
| | 2 | None I | None | | | | |
| | 3 | Pennsylvania 18 | 8503 | | | | |
| | _ | | _ | | | | |

None

None

```
5
              None
                        None
6
              None
                        None
7
              None
                        None
8
              None
                        None
9
         New York
                        None
10
             Shire
                        None
11
              None
                        None
12
              None
                        None
13
                        None
              None
14
              None
                        None
15
              None
                        None
16
     Pennsylvania
                        None
17
              None
                        None
18
              None
                        None
19
         Tatooine
                        None
```

1.0.10 Formatting all 'Yes' and 'No' into 'Y' and 'N' for coherence

```
[88]: df['Paying Customer'] = df['Paying Customer'].str.replace('Yes', 'Y')
    df['Paying Customer'] = df['Paying Customer'].str.replace('No', 'N')
    df['Do_Not_Contact'] = df['Do_Not_Contact'].str.replace('Yes', 'Y')
    df['Do_Not_Contact'] = df['Do_Not_Contact'].str.replace('No', 'N')
    df[['Paying Customer', 'Do_Not_Contact']]
```

```
[88]:
          Paying Customer Do_Not_Contact
       0
                          Y
                                            N
                                            Y
       1
                          N
       2
                          N
       3
                          Y
                                            Y
       4
                          Y
                                            N
                          Y
                                            Y
       5
       6
                          N
                                            N
       7
                          N
                                            N
       8
                          Y
       9
                          Y
                                            N
       10
                          Y
                                            N
       11
                          Y
       12
                          Y
                                            N
       13
                          Y
                                            N
       14
                          N
                                            N
       15
                          N
                                            N
       16
                          Y
                                            N
       17
                          Y
       18
                                            Y
       19
                          Y
                                            N
```

1.0.11 Changing the response of customers who did not specify they don't want to be contacted

```
df[['Do_Not_Contact']]
[89]:
          Do_Not_Contact
       0
       1
                         Y
       2
                         N
       3
                         Y
       4
                         N
       5
                          Y
       6
                          N
       7
                         N
       8
                         N
       9
                         N
       10
                          N
```

[89]: df['Do_Not_Contact'] = df['Do_Not_Contact'].replace('', 'N')

11

12

13

14

15

16

17

18

19

N

N

N

N

N

N

N

Y

N

1.0.12 Drop rows where customers specified they don't want to be contacted

```
[90]: for x in df.index:
    if df.loc[x, 'Do_Not_Contact'] == 'Y':
        df.drop(x, inplace=True)
```

```
[90]:
          CustomerID First_Name
                                    Last_Name
                                               Phone_Number
                 1001
                           Frodo
                                      Baggins
                                                123-545-5421
      0
      2
                 1003
                          Walter
                                        White
      4
                                         Snow
                 1005
                              Jon
                                               876-678-3469
      6
                 1007
                             Jeff
                                       Winger
      7
                 1008
                        Sherlock
                                       Holmes
                                               876-678-3469
                         Gandalf
      8
                 1009
      9
                 1010
                           Peter
                                       Parker
                                               123-545-5421
      10
                 1011
                         Samwise
                                       Gamgee
      11
                 1012
                                       Potter
                           Harry
      12
                             Don
                                       Draper
                 1013
                                               123-543-2345
                                        Knope
      13
                 1014
                          Leslie
                                               876-678-3469
      14
                 1015
                            Toby
                                   Flenderson 304-762-2467
      15
                 1016
                             Ron
                                      Weasley
                                               123-545-5421
```

```
16
          1017
                  Michael
                                  Scott
                                         123-643-9775
17
          1018
                     Clark
                                   Kent
19
          1020
                    Anakin
                              Skywalker
                                         876-678-3469
                             Address Paying Customer Do_Not_Contact
0
              123 Shire Lane, Shire
                                                    Y
                                                                     N
2
                 298 Drugs Driveway
                                                    N
                                                                    N
4
                                                    Y
                   123 Dragons Road
                                                                    N
6
                  1209 South Street
                                                    N
                                                                    N
7
                      98 Clue Drive
                                                    N
                                                                     N
                   123 Middle Earth
                                                    Y
8
                                                                     N
9
        25th Main Street, New York
                                                    Y
                                                                    N
10
             612 Shire Lane, Shire
                                                    Y
                                                                    N
11
               2394 Hogwarts Avenue
                                                    Y
                                                                    N
                                                    Y
12
                   2039 Main Street
                                                                     N
                                                    Y
13
                   343 City Parkway
                                                                     N
14
                      214 HR Avenue
                                                    N
                                                                     N
15
               2395 Hogwarts Avenue
                                                    N
                                                                     N
16
    121 Paper Avenue, Pennsylvania
                                                    Y
                                                                     N
17
                    3498 Super Lane
                                                    Y
                                                                    N
19
       910 Tatooine Road, Tatooine
                                                    Y
                                                                    N
          Street_Address
                                    State Zip_Code
0
          123 Shire Lane
                                    Shire
                                               None
2
      298 Drugs Driveway
                                     None
                                               None
4
        123 Dragons Road
                                     None
                                               None
       1209 South Street
6
                                     None
                                               None
7
           98 Clue Drive
                                     None
                                               None
8
        123 Middle Earth
                                     None
                                               None
9
        25th Main Street
                                 New York
                                               None
10
                                    Shire
          612 Shire Lane
                                               None
11
    2394 Hogwarts Avenue
                                     None
                                               None
12
        2039 Main Street
                                     None
                                               None
13
        343 City Parkway
                                     None
                                               None
14
           214 HR Avenue
                                               None
                                     None
15
    2395 Hogwarts Avenue
                                     None
                                               None
16
        121 Paper Avenue
                             Pennsylvania
                                               None
17
         3498 Super Lane
                                               None
                                     None
19
       910 Tatooine Road
                                 Tatooine
                                               None
```

1.0.13 Drop rows where customers' phone numbers don't exist

```
[91]: for x in df.index:
    if df.loc[x, 'Phone_Number'] == '':
        df.drop(x, inplace=True)
    df.info()
```

<class 'pandas.core.frame.DataFrame'>

Index: 10 entries, 0 to 19
Data columns (total 10 columns):

| # | Column | Non-Null Count | Dtype |
|---|-----------------|----------------|--------|
| | | | |
| 0 | CustomerID | 10 non-null | int64 |
| 1 | First_Name | 10 non-null | object |
| 2 | Last_Name | 10 non-null | object |
| 3 | Phone_Number | 10 non-null | object |
| 4 | Address | 10 non-null | object |
| 5 | Paying Customer | 10 non-null | object |
| 6 | Do_Not_Contact | 10 non-null | object |
| 7 | Street_Address | 10 non-null | object |
| 8 | State | 4 non-null | object |
| 9 | Zip_Code | 0 non-null | object |
| | | | |

dtypes: int64(1), object(9)

memory usage: 1.2+ KB

1.0.14 Reset index

[92]: df = df.reset_index(drop=True)
df

/

| [00]. | C | Dinat Nama | Tast Name | Dhana Namban |
|-------|------------|------------|--------------------|--------------|
| [92]: | CustomeriD | First_Name | ${\tt Last_Name}$ | Phone_Number |
| 0 | 1001 | Frodo | Baggins | 123-545-5421 |
| 1 | 1005 | Jon | Snow | 876-678-3469 |
| 2 | 1008 | Sherlock | Holmes | 876-678-3469 |
| 3 | 1010 | Peter | Parker | 123-545-5421 |
| 4 | 1013 | Don | Draper | 123-543-2345 |
| 5 | 1014 | Leslie | Knope | 876-678-3469 |
| 6 | 1015 | Toby | Flenderson | 304-762-2467 |
| 7 | 1016 | Ron | Weasley | 123-545-5421 |
| 8 | 1017 | Michael | Scott | 123-643-9775 |
| 9 | 1020 | Anakin | Skvwalker | 876-678-3469 |

Address Paying Customer Do_Not_Contact \ 0 123 Shire Lane, Shire Y N 123 Dragons Road Y N 1 2 98 Clue Drive N N 3 25th Main Street, New York Y N 4 Y 2039 Main Street N 5 343 City Parkway Y N 6 214 HR Avenue N N 7 2395 Hogwarts Avenue N N 8 121 Paper Avenue, Pennsylvania Y N 9 910 Tatooine Road, Tatooine Y N

Street_Address State Zip_Code
0 123 Shire Lane Shire None

| 1 | 123 Dragons Road | None | None |
|---|----------------------|--------------|------|
| 2 | 98 Clue Drive | None | None |
| 3 | 25th Main Street | New York | None |
| 4 | 2039 Main Street | None | None |
| 5 | 343 City Parkway | None | None |
| 6 | 214 HR Avenue | None | None |
| 7 | 2395 Hogwarts Avenue | None | None |
| 8 | 121 Paper Avenue | Pennsylvania | None |
| 9 | 910 Tatooine Road | Tatooine | None |