Assignment_week_7 & 8_Raghuwanshi_Prashant_DSC540

October 23, 2021

```
[1]: ##### Assignment: Week 7 & Week 8 Exercise, Understanding Packages
      ##### Name: Prashant Raghuwanshi
      ##### Date: 10/21/2021
      ##### Course: DSC540-T301 Data Preparation (2221-1)
 [2]: # Import libraries
      import numpy as np
      import matplotlib.pyplot as plt
      import pandas as pd
     Chapter 7
[66]: # read MetObjects source file into dataframe- for chapter 7
      MetObjects df = pd.read_csv("C:/Users/dell/Documents/docker/Weeks7&8Data/

→MetObjects1.csv",sep=",")
      MetObjects_df.head(5)
[66]:
        Object Number Is Highlight Is Public Domain Object ID
                                                                         Department \
                                                                 The American Wing
           1979.486.1
                              FALSE
                                                FALSE
                                                               1
      1
           1980.264.5
                              FALSE
                                                FALSE
                                                               2 The American Wing
      2
             67.265.9
                              FALSE
                                                FALSE
                                                              3 The American Wing
      3
                              FALSE
            67.265.10
                                                FALSE
                                                                 The American Wing
            67.265.11
                              FALSE
                                                FALSE
                                                                 The American Wing
        Object Name
                                              Title Culture Period Dynasty
               Coin One-dollar Liberty Head Coin
                                                        NaN
                                                                NaN
                                                                        NaN
                                                               NaN
               Coin Ten-dollar Liberty Head Coin
                                                                        NaN ...
      1
                                                        NaN
      2
               Coin
                        Two-and-a-Half Dollar Coin
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                                                                NaN
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                                                               NaN
      3
               Coin
                        Two-and-a-Half Dollar Coin
                                                        NaN
                                                                        NaN ...
               Coin
                        Two-and-a-Half Dollar Coin
                                                        NaN
                                                                NaN
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        Locale Locus Excavation River Classification Rights and Reproduction
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                 NaN
                             NaN
                                   NaN
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                 NaN
                                   NaN
                                                 Metal
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      1
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                             NaN
      2
           {\tt NaN}
                 NaN
                             NaN
                                   NaN
                                                 Metal
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      3
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                                   NaN
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0 http://www.metmuseum.org/art/collection/search/1
                                                                    NaN
      1 http://www.metmuseum.org/art/collection/search/2
                                                                    NaN
      2 http://www.metmuseum.org/art/collection/search/3
                                                                    NaN
      3 http://www.metmuseum.org/art/collection/search/4
                                                                    NaN
      4 http://www.metmuseum.org/art/collection/search/5
                                                                    NaN
                                       Repository Tags
      O Metropolitan Museum of Art, New York, NY
      1 Metropolitan Museum of Art, New York, NY
      2 Metropolitan Museum of Art, New York, NY
      3 Metropolitan Museum of Art, New York, NY
      4 Metropolitan Museum of Art, New York, NY NaN
      [5 rows x 44 columns]
[67]: # Filter out missing data
      MetObjects_df_filter = MetObjects_df.dropna()
      MetObjects_df_filter.head()
[67]: Empty DataFrame
      Columns: [Object Number, Is Highlight, Is Public Domain, Object ID, Department,
      Object Name, Title, Culture, Period, Dynasty, Reign, Portfolio, Artist Role,
      Artist Prefix, Artist Display Name, Artist Display Bio, Artist Suffix, Artist
      Alpha Sort, Artist Nationality, Artist Begin Date, Artist End Date, Object Date,
      Object Begin Date, Object End Date, Medium, Dimensions, Credit Line, Geography
      Type, City, State, County, Country, Region, Subregion, Locale, Locus,
      Excavation, River, Classification, Rights and Reproduction, Link Resource,
      Metadata Date, Repository, Tags]
      Index: []
      [0 rows x 44 columns]
[68]: # filter the records which contans all N.A
      MetObjects_df_filter_na_only = MetObjects_df.dropna(how='all')
      MetObjects df filter na only.head()
[68]:
        Object Number Is Highlight Is Public Domain Object ID
                                                                      Department \
           1979.486.1
                             FALSE
                                              FALSE
                                                            1 The American Wing
      0
      1
           1980.264.5
                             FALSE
                                              FALSE
                                                            2 The American Wing
      2
             67.265.9
                             FALSE
                                              FALSE
                                                            3 The American Wing
      3
            67.265.10
                             FALSE
                                              FALSE
                                                            4 The American Wing
            67.265.11
                             FALSE
                                              FALSE
                                                            5 The American Wing
       Object Name
                                            Title Culture Period Dynasty
               Coin One-dollar Liberty Head Coin
                                                      NaN
                                                             NaN
                                                                     NaN
      1
               Coin Ten-dollar Liberty Head Coin
                                                      {\tt NaN}
                                                             NaN
                                                                     NaN ...
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Link Resource Metadata Date

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3
               Coin
                        Two-and-a-Half Dollar Coin
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      4
               Coin
                        Two-and-a-Half Dollar Coin
                                                        NaN
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        Locale Locus Excavation River Classification Rights and Reproduction
      0
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                                              Link Resource Metadata Date
         http://www.metmuseum.org/art/collection/search/1
         http://www.metmuseum.org/art/collection/search/2
                                                                       NaN
         http://www.metmuseum.org/art/collection/search/3
                                                                       NaN
      3 http://www.metmuseum.org/art/collection/search/4
                                                                       NaN
      4 http://www.metmuseum.org/art/collection/search/5
                                                                       NaN
                                        Repository Tags
       Metropolitan Museum of Art, New York, NY
      1 Metropolitan Museum of Art, New York, NY
      2 Metropolitan Museum of Art, New York, NY
                                                     NaN
      3 Metropolitan Museum of Art, New York, NY
                                                     NaN
      4 Metropolitan Museum of Art, New York, NY
      [5 rows x 44 columns]
[69]: #Fill in missing data fill in the NaN values by using ffill
      MetObjects_df_ffill = MetObjects_df_filter_na_only.fillna(method='ffill')
      MetObjects_df_ffill.head()
[69]:
        Object Number Is Highlight Is Public Domain Object ID
                                                                         Department \
      0
           1979.486.1
                              FALSE
                                                FALSE
                                                                  The American Wing
                                                               1
           1980.264.5
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      2
             67.265.9
                              FALSE
                                                FALSE
                                                                 The American Wing
      3
            67.265.10
                              FALSE
                                                FALSE
                                                                  The American Wing
            67.265.11
                              FALSE
                                                FALSE
                                                                  The American Wing
        Object Name
                                              Title Culture Period Dynasty
      0
               Coin
                      One-dollar Liberty Head Coin
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      1
               Coin
                     Ten-dollar Liberty Head Coin
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      2
               Coin
                        Two-and-a-Half Dollar Coin
                                                                NaN
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                        Two-and-a-Half Dollar Coin
      3
               Coin
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               Coin
                        Two-and-a-Half Dollar Coin
                                                        NaN
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        Locale Locus Excavation River Classification Rights and Reproduction
      0
           NaN
                 NaN
                             NaN
                                   NaN
                                                 Metal
                                                                            NaN
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Two-and-a-Half Dollar Coin

NaN

NaN

NaN

2

Coin

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2
           NaN
                 NaN
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                                                Metal
                                                                           NaN
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      3
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                 NaN
                             NaN
                                   NaN
                                                Metal
                                                                           NaN
      4
           NaN
                 NaN
                             NaN
                                   NaN
                                                Metal
                                                                           NaN
                                             Link Resource Metadata Date
         http://www.metmuseum.org/art/collection/search/1
                                                                      NaN
        http://www.metmuseum.org/art/collection/search/2
                                                                      NaN
      2 http://www.metmuseum.org/art/collection/search/3
                                                                      NaN
      3 http://www.metmuseum.org/art/collection/search/4
                                                                      NaN
      4 http://www.metmuseum.org/art/collection/search/5
                                                                      NaN
                                        Repository Tags
      O Metropolitan Museum of Art, New York, NY
      1 Metropolitan Museum of Art, New York, NY
                                                    NaN
      2 Metropolitan Museum of Art, New York, NY
                                                    NaN
      3 Metropolitan Museum of Art, New York, NY
                                                    NaN
      4 Metropolitan Museum of Art, New York, NY
      [5 rows x 44 columns]
[60]: #Fill in missing data fill in the NaN values by using bfill
      MetObjects_df_bfill = MetObjects_df_ffill.fillna(method='bfill')
      MetObjects_df_bfill.head()
[60]:
        Object Number Is Highlight Is Public Domain Object ID
                                                                        Department \
      0
           1979.486.1
                              FALSE
                                               FALSE
                                                                 The American Wing
      1
           1980.264.5
                              FALSE
                                               FALSE
                                                                 The American Wing
      2
             67.265.9
                              FALSE
                                               FALSE
                                                                 The American Wing
                                                              3
      3
            67.265.10
                              FALSE
                                               FALSE
                                                                 The American Wing
      4
            67.265.11
                              FALSE
                                               FALSE
                                                                 The American Wing
        Object Name
                                             Title
                                                    Culture
                                                                     Period Dynasty
                                                              United States
      0
                     One-dollar Liberty Head Coin
                                                    Mexican
                                                                               1850
               Coin
                     Ten-dollar Liberty Head Coin
      1
               Coin
                                                    Mexican
                                                              United States
                                                                               1850
      2
               Coin
                       Two-and-a-Half Dollar Coin Mexican
                                                              United States
                                                                               1850
      3
               Coin
                       Two-and-a-Half Dollar Coin
                                                    Mexican
                                                              United States
                                                                               1850
      4
                       Two-and-a-Half Dollar Coin Mexican
               Coin
                                                              United States
                                                                               1850
                  Locale Locus
                                                                         Excavation \
         ... Architecture
                            NaN
                                http://www.metmuseum.org/art/collection/search...
      0
                                 http://www.metmuseum.org/art/collection/search...
         ... Architecture
                            NaN
                                 http://www.metmuseum.org/art/collection/search...
      2
        ... Architecture
                            NaN
      3
         ... Architecture
                                 http://www.metmuseum.org/art/collection/search...
                            NaN
            Architecture
                            \mathtt{NaN}
                                http://www.metmuseum.org/art/collection/search...
        River Classification
                                                     Rights and Reproduction \
```

1

NaN

NaN

NaN

NaN

Metal

NaN

```
2019 Artists Rights Society (ARS), New York
          NaN
                       Metal
      1
      2
          NaN
                       Metal
                                2019 Artists Rights Society (ARS), New York
                                2019 Artists Rights Society (ARS), New York
      3
          NaN
                       Metal
          NaN
                       Metal
                                2019 Artists Rights Society (ARS), New York
                                            Link Resource
                                                                       Metadata Date \
        http://www.metmuseum.org/art/collection/search/1
                                                            2019-02-01T10:50:49.477Z
      1 http://www.metmuseum.org/art/collection/search/2
                                                            2019-02-01T10:50:49.477Z
      2 http://www.metmuseum.org/art/collection/search/3
                                                            2019-02-01T10:50:49.477Z
      3 http://www.metmuseum.org/art/collection/search/4
                                                            2019-02-01T10:50:49.477Z
      4 http://www.metmuseum.org/art/collection/search/5
                                                            2019-02-01T10:50:49.477Z
                                       Repository
                                                           Tags
      O Metropolitan Museum of Art, New York, NY
                                                    Birds | Coins
      1 Metropolitan Museum of Art, New York, NY
                                                    Birds | Coins
      2 Metropolitan Museum of Art, New York, NY
                                                    Birds | Coins
      3 Metropolitan Museum of Art, New York, NY
                                                    Birds | Coins
      4 Metropolitan Museum of Art, New York, NY
                                                    Birds | Coins
      [5 rows x 44 columns]
[70]: #Fill in missing data fill in the NaN values by O
      MetObjects_df_filldata = MetObjects_df_bfill.fillna(0)
      MetObjects_df_filldata.head()
[70]:
        Object Number Is Highlight Is Public Domain Object ID
                                                                       Department \
      0
           1979.486.1
                             FALSE
                                               FALSE
                                                             1
                                                                The American Wing
      1
           1980.264.5
                             FALSE
                                               FALSE
                                                             2
                                                                The American Wing
                                                                The American Wing
      2
             67.265.9
                             FALSE
                                               FALSE
      3
            67.265.10
                             FALSE
                                               FALSE
                                                                The American Wing
            67.265.11
                             FALSE
                                               FALSE
                                                                The American Wing
                                            Title
                                                    Culture
                                                                    Period Dynasty
        Object Name
                     One-dollar Liberty Head Coin
                                                                              1850
      0
               Coin
                                                   Mexican
                                                             United States
      1
                     Ten-dollar Liberty Head Coin
                                                   Mexican
                                                             United States
                                                                              1850
               Coin
      2
               Coin
                       Two-and-a-Half Dollar Coin
                                                    Mexican
                                                             United States
                                                                              1850
                       Two-and-a-Half Dollar Coin
      3
               Coin
                                                   Mexican
                                                             United States
                                                                              1850
      4
                       Two-and-a-Half Dollar Coin
               Coin
                                                    Mexican
                                                             United States
                                                                              1850
                  Locale Locus
                                                                        Excavation \
           Architecture
                                http://www.metmuseum.org/art/collection/search...
      0
                                http://www.metmuseum.org/art/collection/search...
      1
        ... Architecture
                           0.0
                                http://www.metmuseum.org/art/collection/search...
      2
         ... Architecture
                           0.0
      3
        ... Architecture
                           0.0
                                http://www.metmuseum.org/art/collection/search...
                           0.0 http://www.metmuseum.org/art/collection/search...
      4 ... Architecture
```

2019 Artists Rights Society (ARS), New York

0

NaN

Metal

```
0.0
                                2019 Artists Rights Society (ARS), New York
                       Metal
      1
          0.0
                       Metal
                                2019 Artists Rights Society (ARS), New York
      2
          0.0
                                2019 Artists Rights Society (ARS), New York
                       Metal
      3
          0.0
                       Metal
                                2019 Artists Rights Society (ARS), New York
                                2019 Artists Rights Society (ARS), New York
          0.0
                       Metal
                                            Link Resource
                                                                       Metadata Date \
       http://www.metmuseum.org/art/collection/search/1
                                                           2019-02-01T10:50:49.477Z
      1 http://www.metmuseum.org/art/collection/search/2
                                                           2019-02-01T10:50:49.477Z
      2 http://www.metmuseum.org/art/collection/search/3 2019-02-01T10:50:49.477Z
      3 http://www.metmuseum.org/art/collection/search/4
                                                           2019-02-01T10:50:49.477Z
      4 http://www.metmuseum.org/art/collection/search/5
                                                           2019-02-01T10:50:49.477Z
                                       Repository
                                                           Tags
      O Metropolitan Museum of Art, New York, NY
                                                   Birds | Coins
      1 Metropolitan Museum of Art, New York, NY
                                                   Birds | Coins
      2 Metropolitan Museum of Art, New York, NY
                                                   Birds | Coins
      3 Metropolitan Museum of Art, New York, NY
                                                   Birds | Coins
      4 Metropolitan Museum of Art, New York, NY
                                                   Birds | Coins
      [5 rows x 44 columns]
[62]: # Remove duplicates based on second and third columns value
      MetObjects_df_rm_dup = MetObjects_df_filldata.drop_duplicates(['Department',_
       →'Object Name', 'Title', 'Culture'], keep='last')
      MetObjects_df_rm_dup.head()
[62]:
         Object Number Is Highlight Is Public Domain Object ID
                                                                        Department
      0
            1979.486.1
                              FALSE
                                               FALSE
                                                                 The American Wing
      1
            1980.264.5
                              FALSE
                                               FALSE
                                                                 The American Wing
      8
             67.265.15
                              FALSE
                                               FALSE
                                                              9
                                                                 The American Wing
      9
            1979.486.3
                              FALSE
                                               FALSE
                                                             10
                                                                 The American Wing
      10
            1979.486.2
                              FALSE
                                               FALSE
                                                             11
                                                                 The American Wing
         Object Name
                                                        Title Culture \
      0
                Coin
                                 One-dollar Liberty Head Coin Mexican
      1
                Coin
                                 Ten-dollar Liberty Head Coin Mexican
      8
                Coin
                                   Two-and-a-Half Dollar Coin Mexican
                Coin
                       Two-and-a-half-dollar Indian Head Coin Mexican
      9
      10
                Coin
                      Two-and-a-half-dollar Liberty Head Coin Mexican
                 Period Dynasty
                                          Locale Locus
          United States
                           1850
                                                   0.0
      0
                                 ... Architecture
      1
          United States
                           1850
                                 ... Architecture
                                                   0.0
      8
          United States
                           1850
                                 ... Architecture
                                                   0.0
          United States
                           1850
                                    Architecture
                                                   0.0
```

Rights and Reproduction \

River Classification

```
Excavation River Classification \
      0
          http://www.metmuseum.org/art/collection/search...
                                                              0.0
                                                                           Metal
          http://www.metmuseum.org/art/collection/search...
                                                              0.0
                                                                           Metal
      1
          http://www.metmuseum.org/art/collection/search...
                                                             0.0
                                                                           Metal
      8
          http://www.metmuseum.org/art/collection/search...
                                                              0.0
      9
                                                                           Metal
          http://www.metmuseum.org/art/collection/search...
                                                              0.0
                                                                           Metal
                                 Rights and Reproduction \
      0
           2019 Artists Rights Society (ARS), New York
      1
           2019 Artists Rights Society (ARS), New York
      8
           2019 Artists Rights Society (ARS), New York
      9
           2019 Artists Rights Society (ARS), New York
           2019 Artists Rights Society (ARS), New York
      10
                                               Link Resource \
      0
           http://www.metmuseum.org/art/collection/search/1
           http://www.metmuseum.org/art/collection/search/2
      1
      8
           http://www.metmuseum.org/art/collection/search/9
          http://www.metmuseum.org/art/collection/search/10
      9
          http://www.metmuseum.org/art/collection/search/11
                     Metadata Date
                                                                    Repository \
                                     Metropolitan Museum of Art, New York, NY
      0
          2019-02-01T10:50:49.477Z
      1
          2019-02-01T10:50:49.477Z
                                     Metropolitan Museum of Art, New York, NY
                                     Metropolitan Museum of Art, New York, NY
          2019-07-31T03:00:40.447Z
          2019-07-31T03:00:40.447Z
                                     Metropolitan Museum of Art, New York, NY
      9
      10 2019-07-31T03:00:40.447Z
                                     Metropolitan Museum of Art, New York, NY
                         Tags
      0
                  Birds | Coins
      1
                  Birds | Coins
      8
          Eagles | Men | Profiles
      9
          Eagles | Men | Profiles
         Eagles | Men | Profiles
      [5 rows x 44 columns]
[71]: #Transform data using either mapping or a function
      y_n_to_num = {'TRUE':1, 'FALSE': 0}
      MetObjects df rm_dup['Is Highlight'] = MetObjects_df_rm_dup['Is Highlight'].
       →map(y_n_to_num)
[65]: MetObjects_df_rm_dup.head()
```

1850 ... Architecture

0.0

10 United States

```
[65]:
        Object Number Is Highlight Is Public Domain Object ID
                                                                          Department
           1979.486.1
      0
                                 0.0
                                                 FALSE
                                                                1
                                                                   The American Wing
      1
           1980.264.5
                                 0.0
                                                 FALSE
                                                               2
                                                                   The American Wing
      2
             67.265.9
                                 0.0
                                                 FALSE
                                                               3
                                                                   The American Wing
                                                                   The American Wing
      3
            67.265.10
                                 0.0
                                                 FALSE
      4
            67.265.11
                                 0.0
                                                 FALSE
                                                                   The American Wing
                                                               5
        Object Name
                                              Title Culture Period Dynasty
      0
               Coin
                     One-dollar Liberty Head Coin
                                                        NaN
                                                               NaN
                                                                        NaN
      1
               Coin
                     Ten-dollar Liberty Head Coin
                                                        NaN
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                                                                        NaN
      2
                        Two-and-a-Half Dollar Coin
               Coin
                                                        NaN
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                                                                        {\tt NaN}
      3
               Coin
                        Two-and-a-Half Dollar Coin
                                                        NaN
                                                               NaN
                                                                        NaN
      4
                        Two-and-a-Half Dollar Coin
               Coin
                                                               NaN
                                                        NaN
                                                                        {\tt NaN}
        Locale Locus Excavation River Classification Rights and Reproduction
           NaN
                 NaN
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                                                 Metal
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                                              Link Resource Metadata Date
       http://www.metmuseum.org/art/collection/search/1
                                                                       NaN
      1 http://www.metmuseum.org/art/collection/search/2
                                                                       NaN
      2 http://www.metmuseum.org/art/collection/search/3
                                                                       NaN
      3 http://www.metmuseum.org/art/collection/search/4
                                                                       NaN
      4 http://www.metmuseum.org/art/collection/search/5
                                                                       NaN
                                        Repository Tags
      O Metropolitan Museum of Art, New York, NY
      1 Metropolitan Museum of Art, New York, NY
      2 Metropolitan Museum of Art, New York, NY
      3 Metropolitan Museum of Art, New York, NY
                                                     NaN
      4 Metropolitan Museum of Art, New York, NY
      [5 rows x 44 columns]
[72]: #Replace values
      MetObjects_df_rm_dup['Is Public Domain'] = MetObjects_df_rm_dup['Is Public_
       →Domain'].replace(['TRUE', 'FALSE'], [1, 0])
      MetObjects_df_rm_dup.head()
[72]:
         Object Number
                         Is Highlight Is Public Domain Object ID
                                                                           Department \
            1979.486.1
                                  0.0
      0
                                                      0
                                                                    The American Wing
                                                                 1
      1
            1980.264.5
                                  0.0
                                                      0
                                                                 2
                                                                    The American Wing
                                  0.0
                                                      0
                                                                    The American Wing
      8
             67.265.15
                                                                    The American Wing
      9
            1979.486.3
                                  0.0
                                                      0
                                                                10
```

```
10
      1979.486.2
                           0.0
                                               0
                                                            The American Wing
   Object Name
                                                   Title Culture
0
          Coin
                            One-dollar Liberty Head Coin Mexican
          Coin
                           Ten-dollar Liberty Head Coin Mexican
1
8
          Coin
                             Two-and-a-Half Dollar Coin Mexican
          Coin
                 Two-and-a-half-dollar Indian Head Coin Mexican
9
10
          Coin
                Two-and-a-half-dollar Liberty Head Coin Mexican
           Period Dynasty
                                     Locale Locus
                     1850
0
    United States
                              Architecture
                                              0.0
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    United States
                     1850
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8
    United States
                     1850
                           ... Architecture
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9
    United States
                     1850
                           ... Architecture
                                              0.0
10
   United States
                     1850
                              Architecture
                                              0.0
                                            Excavation River Classification \
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    http://www.metmuseum.org/art/collection/search...
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                                                                     Metal
    http://www.metmuseum.org/art/collection/search...
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1
                                                                     Metal
    http://www.metmuseum.org/art/collection/search...
                                                       0.0
                                                                     Metal
8
    http://www.metmuseum.org/art/collection/search...
                                                       0.0
9
                                                                     Metal
   http://www.metmuseum.org/art/collection/search...
                                                       0.0
                                                                     Metal
                          Rights and Reproduction \
0
     2019 Artists Rights Society (ARS), New York
1
     2019 Artists Rights Society (ARS), New York
     2019 Artists Rights Society (ARS), New York
8
9
     2019 Artists Rights Society (ARS), New York
10
     2019 Artists Rights Society (ARS), New York
                                         Link Resource \
0
     http://www.metmuseum.org/art/collection/search/1
     http://www.metmuseum.org/art/collection/search/2
1
     http://www.metmuseum.org/art/collection/search/9
8
9
    http://www.metmuseum.org/art/collection/search/10
   http://www.metmuseum.org/art/collection/search/11
               Metadata Date
                                                             Repository \
0
    2019-02-01T10:50:49.477Z
                              Metropolitan Museum of Art, New York, NY
    2019-02-01T10:50:49.477Z
                               Metropolitan Museum of Art, New York, NY
1
                               Metropolitan Museum of Art, New York, NY
8
    2019-07-31T03:00:40.447Z
9
    2019-07-31T03:00:40.447Z
                               Metropolitan Museum of Art, New York, NY
   2019-07-31T03:00:40.447Z
                              Metropolitan Museum of Art, New York, NY
                   Tags
            Birds | Coins
0
1
            Birds | Coins
```

```
8
          Eagles | Men | Profiles
          Eagles | Men | Profiles
      10 Eagles | Men | Profiles
      [5 rows x 44 columns]
[84]: # Drop bad data from Object ID columns
      MetObjects_df_rm_dup = MetObjects_df_rm_dup[pd.
       -to_numeric(MetObjects_df_rm_dup['Object ID'], errors='coerce').notnull()]
[88]: MetObjects_df_rm_dup['Object ID'].unique()
[88]: array(['1', '2', '9', ..., '11815', '11816', '11817'], dtype=object)
[92]: # Discretization and Binning
      bins = [2000,4000,8000,10000,11817]
      ObjectID bin = pd.cut(pd.to_numeric(MetObjects_df_rm_dup['Object_ID']), bins)
[93]: pd.value_counts(ObjectID_bin)
[93]: (10000, 11817]
                         1456
      (4000, 8000]
                          882
      (2000, 4000]
                          499
      (8000, 10000]
                          302
      Name: Object ID, dtype: int64
     Chapter 8
[16]: | # read BOING-CANDY-HIERARCHY-2016-SURVEY-Responses source file into dataframe-
      \hookrightarrow for chapter 8
      boing_candy_df = pd.read_excel (r"C:/Users/dell/Documents/docker/Weeks7&8Data/
      →BOING-BOING-CANDY-HIERARCHY-2016-SURVEY-Responses.xlsx")
      # display firt 5 records
      boing_candy_df.head(5)
[16]:
                       Timestamp \
      0 2016-10-24 05:09:23.033
      1 2016-10-24 05:09:54.798
      2 2016-10-24 05:13:06.734
      3 2016-10-24 05:14:17.192
      4 2016-10-24 05:14:24.625
        Are you going actually going trick or treating yourself? Your gender: \
      0
                                                          No
                                                                            Male
      1
                                                          No
                                                                            Male
      2
                                                                          Female
                                                          No
      3
                                                                            Male
                                                          No
      4
                                                         Yes
                                                                            Male
```

```
How old are you? Which country do you live in?
0
                22
                                            Canada
                45
1
                                               usa
2
                48
                                                US
3
                57
                                               usa
4
                42
                                               USA
 Which state, province, county do you live in?
                                                    [100 Grand Bar]
0
                                          Ontario
1
                                               il
                                                                MEH
2
                                         Colorado
                                                                JOY
3
                                                                JOY
4
                                     South Dakota
                                                                MEH
   [Anonymous brown globs that come in black and orange wrappers]
0
                                               DESPAIR
1
                                                   MEH
2
                                               DESPAIR
3
                                                   MEH
                                               DESPAIR
   [Any full-sized candy bar]
                                [Black Jacks]
0
                           JOY
1
                           JOY
                                           JOY
2
                           JOY
                                           MEH
3
                           JOY
                                           MEH
                           JOY
                                       DESPAIR ...
 Please estimate the degree(s) of separation you have from the following
celebrities [JK Rowling]
                                           3 or higher
                                           3 or higher
1
2
                                           3 or higher
3
                                           3 or higher
4
                                           3 or higher
 Please estimate the degree(s) of separation you have from the following
celebrities [JJ Abrams] \
0
                                                      2
1
                                           3 or higher
2
                                           3 or higher
3
                                           3 or higher
                                           3 or higher
```

Please estimate the degree(s) of separation you have from the following celebrities [Beyoncé] $\$

```
0
                                          3 or higher
1
                                          3 or higher
2
                                          3 or higher
3
                                          3 or higher
4
                                          3 or higher
 Please estimate the degree(s) of separation you have from the following
celebrities [Bieber] \
                                          3 or higher
1
                                          3 or higher
2
                                          3 or higher
3
                                          3 or higher
                                          3 or higher
 Please estimate the degree(s) of separation you have from the following
celebrities [Kevin Bacon] \
0
                                          3 or higher
1
                                          3 or higher
2
                                          3 or higher
3
                                          3 or higher
                                          3 or higher
 Please estimate the degree(s) of separation you have from the following
celebrities [Francis Bacon (1561 - 1626)] \
                                          3 or higher
1
                                          3 or higher
2
                                          3 or higher
3
                                          3 or higher
                                          3 or higher
 Which day do you prefer, Friday or Sunday?
                                       Friday
0
1
                                       Friday
2
                                       Sunday
3
                                       Sunday
4
                                       Friday
 Do you eat apples the correct way, East to West (side to side) or do you eat
them like a freak of nature, South to North (bottom to top)? \
                                       South to North
0
                                         East to West
1
2
                                         East to West
3
                                       South to North
                                         East to West
```

When you see the above image of the 4 different websites, which one would you most likely check out (please be honest). $\$

```
1
                        Science: Latest News and Headlines
      2
                        Science: Latest News and Headlines
      3
                        Science: Latest News and Headlines
      4
                                                      ESPN
         [York Peppermint Patties] Ignore
     0
                                      NaN
      1
                                      NaN
      2
                                      NaN
      3
                                      NaN
      4
                                      NaN
      [5 rows x 123 columns]
[17]: #before doing hierarchical index, will quickly fix the missing data issue &
      → data quality issue as below
      # filter the records which contans all N.A
      boing_candy_df_filter_na_only = boing_candy_df.dropna(how='all')
      #Fill in missing data fill in the NaN values by using ffill
      boing_candy_df_ffill = boing_candy_df_filter_na_only.fillna(method='ffill')
      #Fill in missing data fill in the NaN values by using ffill
      boing_candy_df_bfill = boing_candy_df_ffill.fillna(method='bfill')
      #Fill in missing data fill in the NaN values by O
      boing_candy_df_filldata = boing_candy_df_bfill.fillna(0)
[18]: # transforming the countries name to country code
      # find the list of unique countries present in country columns
      unique_countries = boing_candy_df_filldata['Which country do you live in?'].
      →unique()
      unique_countries
[18]: array(['Canada', 'usa', 'US', 'USA', 'UK', 'United States of America',
             'uSA', 'Japan', 'united states', 'USA', 'canada', 'United States',
             'us', 'france', 'USSA', 'United States of America ', 'U.S.A.',
             'A tropical island south of the equator', 'england', 'uk',
             'Switzerland', 'Murica', 'United Kingdom', 'Neverland', 'USA!',
             'this one',
             "USA (I think but it's an election year so who can really tell)",
             'Korea', 51, 'Usa', 'U.S.', 'Us', 'America ', 'Units States',
             'belgium', 'croatia', 'United states', 'Portugal', 'England',
             'USA USA USA', 'the best one - usa', 'USA! USA! USA!', 47,
             'united states ', 'Cascadia', 'españa', 'u.s.',
             "there isn't one for old men", 'United States ', 'Panama',
             'one of the best ones', 'The Yoo Ess of Aaayyyyyy',
             'United Kindom', 'France', 'America', 'Australia', 'hungary',
             'united states of america', 'UK ', 'Austria', 'Somewhere',
```

Science: Latest News and Headlines

0

```
"god's country", 'South Korea', 'USA!!!!!!', 'Philippines',
             'United States', 'EUA', 'USA! USA!', 45, 'sweden', 'Canada',
             'United Sates', "Sub-Canadian North America... 'Merica",
             'The Netherlands', 'Finland', 'Trumpistan', 'U.s.', 'Merica',
             'China', 'germany', 'See above', 'UNited States', 'kenya', 30,
             'Netherlands', 'The republic of Cascadia', 'United Stetes',
             'america', 'Not the USA or Canada', 'USA USA USA USA',
             'New Zealand', 'United States of America', 'netherlands',
             'Denial', 'United State'], dtype=object)
[19]: # create function to verify the digits in string
      def contains_digit(s):
          isdigit = str.isdigit
          return any(map(isdigit,str(s)))
[20]: # create function to normalizing the countries name
      import pycountry
      def fix_country_name(txt):
          txt1 = ''
          if contains_digit(txt) == False:
              for country in pycountry.countries:
                  if country.name in txt:
                      #Country's code
                      return(country.alpha_2)
              return('US')
[21]: # transforming the country name to country code
      boing_candy_df_filldata['Which country do you live in?'] = ___
       →boing_candy_df_filldata['Which country do you live in?'].apply(lambda x:
       \hookrightarrowfix country name(x))
[22]: # list out unique transforms country codes
      boing candy df filldata['Which country do you live in?'].unique()
[22]: array(['CA', 'US', 'JP', 'CH', 'GB', None, 'PT', 'PA', 'FR', 'AU', 'AT',
             'NZ', 'DE', 'MX', 'PH', 'NL', 'FI', 'CN'], dtype=object)
[23]: #Hierarchical Indexing
      hir_boing_candy_df = boing_candy_df_filldata.set_index(['Which country do you_
       ⇒live in?', 'Which state, province, county do you live in?'])
[24]: hir_boing_candy_df.head()
[24]:
                Timestamp \
      Which country do you live in? Which state, province, county do you live in?
      CA
                                    Ontario
```

'New Zealand', 54, 'Germany', 'Mexico', 44, 'Brasil',

```
2016-10-24 05:09:23.033
                              il
2016-10-24 05:09:54.798
                              Colorado
2016-10-24 05:13:06.734
                              il
2016-10-24 05:14:17.192
                              South Dakota
2016-10-24 05:14:24.625
                                                                             Are
you going actually going trick or treating yourself? \
Which country do you live in? Which state, province, county do you live in?
CA
                              Ontario
No
US
                              il
No
                              Colorado
No
                              il
No
                              South Dakota
Yes
                                                                             Your
Which country do you live in? Which state, province, county do you live in?
CA
                              Ontario
Male
US
                              il
Male
                              Colorado
Female
                              il
Male
                              South Dakota
Male
                                                                             How
old are you? \
Which country do you live in? Which state, province, county do you live in?
CA
                              Ontario
22
US
                              il
45
                              Colorado
```

48

il

57

South Dakota

42

[100 Grand Bar] \

Which country do you live in? Which state, province, county do you live in?

CA Ontario

JOY

US il

MEH

Colorado

JOY

il

JOY

South Dakota

MEH

[Anonymous brown globs that come in black and orange wrappers] \

Which country do you live in? Which state, province, county do you live in?

CA Ontario

DESPAIR

US il

MEH

Colorado

DESPAIR

il

MEH

South Dakota

DESPAIR

[Any full-sized candy bar] \

Which country do you live in? Which state, province, county do you live in?

CA Ontario

JOY

US il

JOY

Colorado

JOY

il

JOY

South Dakota

JOY

[Black Jacks] \

Which country do you live in? Which state, province, county do you live in?

CA Ontario

```
MEH
US
                              il
JOY
                              Colorado
MEH
                              il
MEH
                              South Dakota
DESPAIR
[Bonkers (the candy)] \
Which country do you live in? Which state, province, county do you live in?
                              Ontario
CA
MEH
US
                              il
DESPAIR
                              Colorado
MEH
                              il
MEH
                              South Dakota
MEH
[Bonkers (the board game)] \
Which country do you live in? Which state, province, county do you live in?
CA
                              Ontario
MEH
US
                              il
MEH
                              Colorado
JOY
                              il
DESPAIR
                              South Dakota
JOY
Which country do you live in? Which state, province, county do you live in?
                              Ontario
CA
US
                              il
                              Colorado
                              South Dakota
Please estimate the degree(s) of separation you have from the following
```

celebrities [JK Rowling] \

Which country do you live in? Which state, province, county do you live in? Ontario CA 3 or higher US il 3 or higher Colorado 3 or higher il 3 or higher South Dakota 3 or higher Please estimate the degree(s) of separation you have from the following celebrities [JJ Abrams] Which country do you live in? Which state, province, county do you live in? CA Ontario 2 US il 3 or higher Colorado 3 or higher i٦ 3 or higher South Dakota 3 or higher Please estimate the degree(s) of separation you have from the following celebrities [Beyoncé] \ Which country do you live in? Which state, province, county do you live in? CAOntario 3 or higher il 3 or higher Colorado 3 or higher il 3 or higher South Dakota 3 or higher Please estimate the degree(s) of separation you have from the following celebrities [Bieber] Which country do you live in? Which state, province, county do you live in? CAOntario 3 or higher il 3 or higher

Colorado 3 or higher il 3 or higher South Dakota 3 or higher Please estimate the degree(s) of separation you have from the following celebrities [Kevin Bacon] \ Which country do you live in? Which state, province, county do you live in? CA Ontario 3 or higher US il 3 or higher Colorado 3 or higher il 3 or higher South Dakota 3 or higher Please estimate the degree(s) of separation you have from the following celebrities [Francis Bacon (1561 - 1626)] \ Which country do you live in? Which state, province, county do you live in? CAOntario 3 or higher US il 3 or higher Colorado 3 or higher il 3 or higher South Dakota 3 or higher Which day do you prefer, Friday or Sunday? \ Which country do you live in? Which state, province, county do you live in? CAOntario Friday US il Friday Colorado Sunday il Sunday South Dakota

Friday

Do

you eat apples the correct way, East to West (side to side) or do you eat them like a freak of nature, South to North (bottom to top)? \

Which country do you live in? Which state, province, county do you live in?

CA Ontario

South to North

US il

East to West

Colorado

East to West

il

South to North

South Dakota

East to West

When

you see the above image of the 4 different websites, which one would you most likely check out (please be honest). $\$

Which country do you live in? Which state, province, county do you live in?

CA Ontario

Science: Latest News and Headlines US il Science: Latest News and Headlines

Colorado

Science: Latest News and Headlines

il

Science: Latest News and Headlines

South Dakota

ESPN

[York Peppermint Patties] Ignore

Which country do you live in? Which state, province, county do you live in?

CA Ontario

0.0

US il

0.0

Colorado

0.0

il

0.0

South Dakota

0.0

[5 rows x 121 columns]

```
[25]: # Combine and Merge Datasets (you will have to either create a new dataset from
      →your existing data or create a relationship between the data I have provided)
      #creating new dataframe contains country code:
     \hookrightarrow 'JP', 'CH', 'GB', None, 'PT', 'PA', 'FR', 'AU', 'AT',
             'NZ', 'DE', 'MX', 'PH', 'NL', 'FI', 'CN'], 'cnt_code': range(18)})
     df_country_cd.head()
[25]:
       Which country do you live in?
                                     cnt code
                                  US
                                             1
     1
     2
                                  JΡ
                                             2
     3
                                  CH
                                             3
     4
                                  GB
                                             4
[26]: #Combine and Merge Datasets (you will have to either create a new dataset from
      →your existing data or create a relationship between the data I have provided)
      # Merge Datasets
     pd.merge(df_country_cd, hir_boing_candy_df, on='Which country do you live in?').
      →tail()
          Which country do you live in?
                                        cnt code
[26]:
                                                               Timestamp \
     1254
                                     PΗ
                                               14 2016-10-24 20:52:29.673
     1255
                                     NL
                                               15 2016-10-27 04:21:22.486
     1256
                                     NT.
                                               15 2016-10-27 11:56:38.098
     1257
                                     FΙ
                                               16 2016-10-27 05:33:18.091
     1258
                                     CN
                                               17 2016-10-27 09:51:48.159
          Are you going actually going trick or treating yourself? Your gender: \
     1254
                                                                          Male
     1255
                                                         No
                                                                          Male
     1256
                                                         No
                                                                          Male
     1257
                                                         No
                                                                          Male
     1258
                                                        Yes
                                                                         Other
          How old are you? [100 Grand Bar] \
     1254
                                        MEH
                        44
     1255
                        25
                                        MF.H
     1256
                       50+
                                        MEH
     1257
                                        MF.H
                        34
     1258
                        67
                                    DESPAIR
           [Anonymous brown globs that come in black and orange wrappers] \
     1254
                                                    DESPAIR
     1255
                                                        MEH
     1256
                                                        MEH
     1257
                                                    DESPAIR
```

1258 JOY

```
[Any full-sized candy bar]
                                   [Black Jacks]
1254
                             MEH
1255
                             JOY
                                         DESPAIR ...
1256
                             JOY
                                             MEH
1257
                             JOY
                                             MEH
1258
                             JOY
                                             MEH
     Please estimate the degree(s) of separation you have from the following
celebrities [JK Rowling] \
1254
                                             3 or higher
1255
                                             3 or higher
1256
                                             3 or higher
1257
                                             3 or higher
1258
     Please estimate the degree(s) of separation you have from the following
celebrities [JJ Abrams]
1254
                                             3 or higher
1255
                                             3 or higher
1256
                                             3 or higher
1257
                                             3 or higher
1258
                                             3 or higher
     Please estimate the degree(s) of separation you have from the following
celebrities [Beyoncé] \
1254
                                             3 or higher
1255
                                             3 or higher
1256
                                             3 or higher
1257
                                             3 or higher
1258
                                             3 or higher
     Please estimate the degree(s) of separation you have from the following
celebrities [Bieber] \
1254
                                             3 or higher
1255
                                             3 or higher
1256
                                             3 or higher
1257
1258
                                             3 or higher
     Please estimate the degree(s) of separation you have from the following
celebrities [Kevin Bacon] \
1254
                                             3 or higher
1255
                                                       2
1256
                                             3 or higher
1257
                                             3 or higher
```

1258 2

```
Please estimate the degree(s) of separation you have from the following
      celebrities [Francis Bacon (1561 - 1626)] \
      1254
                                                   3 or higher
      1255
                                                   3 or higher
      1256
                                                   3 or higher
      1257
                                          Actually, that's me.
      1258
           Which day do you prefer, Friday or Sunday? \
      1254
                                                Friday
      1255
                                                Friday
      1256
                                                Sunday
      1257
                                                Friday
      1258
                                                Friday
           Do you eat apples the correct way, East to West (side to side) or do you
      eat them like a freak of nature, South to North (bottom to top)? \
      1254
                                                  East to West
      1255
                                      scoops with sharp spoon.
      1256
                                                  East to West
      1257
                                                  East to West
      1258
                                                    Applesauce
           When you see the above image of the 4 different websites, which one would
      you most likely check out (please be honest).
      1254
                           Science: Latest News and Headlines
      1255
                           Science: Latest News and Headlines
      1256
                           Science: Latest News and Headlines
      1257
                           Science: Latest News and Headlines
      1258
                                                    Daily Dish
            [York Peppermint Patties] Ignore
      1254
                                          0.0
      1255
                                          0.0
      1256
                                          0.0
      1257
                                          0.0
      1258
                                          0.0
      [5 rows x 123 columns]
[27]: #Reshape
      hir_boing_candy_df.stack().head()
```

[27]: Which country do you live in? Which state, province, county do you live in?

CA Ontario

```
05:09:23.033000
     Are you going actually going trick or treating yourself?
     Your gender:
     Male
     How old are you?
     22
     [100 Grand Bar]
     JOY
     dtype: object
[28]: # Pivot the data
     hir_boing_candy_df.pivot_table(index='Which country do you live in?', __
      [28]: Your gender:
                                                                            Female
     Which country do you live in?
     AΤ
                                                                               NaN
     ΑU
                                                                           [66, 45]
     CA
                                   [44, 37, 38, 37, 58, 64, 37, 33, 47, 32, 29, 3...
     CH
                                                                              [35]
     CN
                                                                               NaN
     DE
                                                                          [43, 38]
     FΙ
                                                                               NaN
     FR
                                                                              Г187
                                                                          [31, 38]
     GB
     JΡ
                                                                               NaN
     MX
                                                                               NaN
     NL
                                                                               {\tt NaN}
     NZ
                                                                               NaN
     PA
                                                                               NaN
     PH
                                                                               NaN
     PΤ
                                                                               NaN
     US
                                   [48, 41, 46, 31, 33, 16, 51, 33, 37, 35, 32, 4...
     Your gender:
                                                                 I'd rather not say
     Which country do you live in?
                                                                               NaN
     ΑU
                                                                          [over 40]
     CA
                                                  [older than I want to be, 47, 35]
     СН
                                                                               NaN
     CN
                                                                               NaN
     DΕ
                                                                               NaN
     FΙ
                                                                               NaN
```

2016-10-24

Timestamp

```
FR
                                                                                            {\tt NaN}
GB
                                                                                            {\tt NaN}
JΡ
                                                                                            {\tt NaN}
MX
                                                                                            NaN
NL
                                                                                            NaN
NZ
                                                                                           [34]
PA
                                                                                            NaN
PH
                                                                                            {\tt NaN}
PΤ
                                                                                            NaN
US
                                     [31, 33, 35, 78, old enough, 50s, 63, 29, Old ...
Your gender:
                                                                                           Male
Which country do you live in?
ΑT
                                                                                           [33]
AU
                                                                                            NaN
                                     [22, 28, 34, 58, 38, 48, 31, 42, 53, 17, 35, 3...
CA
CH
                                                                                            {\tt NaN}
CN
                                                                                            {\tt NaN}
DE
                                                                                      [47, 43]
FΙ
                                                                                           [34]
FR
                                                                                            NaN
GB
                                                                                      [41, 27]
JΡ
                                                                                  [45, 47, 34]
                                                                                  [54, 37, 38]
MX
NL
                                                                                     [25, 50+]
NZ
                                                                                  [64, 49, 33]
PA
                                                                                           [47]
PΗ
                                                                                           [44]
PT
                                                                                           [58]
US
                                     [45, 57, 42, 41, 47, 44, 41, 40, 35, 49, 44, 4...
Your gender:
                                                                                          Other
Which country do you live in?
ΑT
                                                                                            NaN
AU
                                                                                           [42]
CA
                                                                                            NaN
CH
                                                                                            {\tt NaN}
CN
                                                                                           [67]
DE
                                                                                            NaN
FI
                                                                                            NaN
                                                                                            NaN
FR
GB
                                                                                            NaN
JΡ
                                                                                           [54]
MX
                                                                                            {\tt NaN}
NL
                                                                                            {\tt NaN}
NZ
                                                                                            {\tt NaN}
```

```
PA
                                                                                       NaN
      PΗ
                                                                                       NaN
      PT
                                                                                       NaN
      US
                                       [34, 23, 17, 28, 19, 32, 22, 26, 29, 26, 44, 4...
     Chapter 10
[29]: # read candyhierarchy2017.xlsx source file into dataframe- for chapter 10
      candy_2017_df = pd.read_excel (r"C:/Users/dell/Documents/docker/Weeks7&8Data/
       ⇔candyhierarchy2017.xlsx")
      # display firt 5 records
      candy_2017_df.head(5)
     C:\ProgramData\Anaconda3\lib\site-packages\openpyxl\worksheet\_reader.py:312:
     UserWarning: Unknown extension is not supported and will be removed
       warn(msg)
[29]:
         Internal ID Q1: GOING OUT? Q2: GENDER Q3: AGE Q4: COUNTRY
            90258773
                                 NaN
                                             NaN
                                                     NaN
                                                                  NaN
      1
            90272821
                                  No
                                            Male
                                                       44
                                                                 USA
      2
            90272829
                                 NaN
                                            Male
                                                       49
                                                                  USA
      3
            90272840
                                  No
                                            Male
                                                       40
                                                                   us
      4
            90272841
                                  No
                                            Male
                                                       23
                                                                  usa
        Q5: STATE, PROVINCE, COUNTY, ETC Q6 | 100 Grand Bar
      0
                                       NaN
                                                           NaN
                                                           MEH
      1
                                        NM
      2
                                                           NaN
                                 Virginia
      3
                                                           MEH
                                        or
      4
                                                           JOY
                                 exton pa
        Q6 | Anonymous brown globs that come in black and orange wrappers\t(a.k.a.
      Mary Janes) \
      0
                                                          NaN
                                                     DESPAIR
      1
      2
                                                          NaN
      3
                                                     DESPAIR
      4
                                                     DESPAIR
        Q6 | Any full-sized candy bar Q6 | Black Jacks
                                                         ... Q8: DESPAIR OTHER \
      0
                                   NaN
                                                     {\tt NaN}
                                                                            NaN
                                    JOY
      1
                                                     MEH
                                                                            NaN
      2
                                   NaN
                                                                            NaN
                                                     NaN
      3
                                    JOY
                                                     MEH
                                                                            NaN
      4
                                    JOY
                                                 DESPAIR
                                                                            NaN
                                          Q9: OTHER COMMENTS
                                                                   Q10: DRESS
      0
                                                          NaN
                                                                           NaN
```

```
2
                                                         NaN
      3
                                     Raisins can go to hell
                                                              White and gold
      4
                                                         NaN
                                                              White and gold
        Unnamed: 113 Q11: DAY Q12: MEDIA [Daily Dish] Q12: MEDIA [Science]
      0
                 NaN
                           NaN
                                                    NaN
                                                                          NaN
                                                                          1.0
      1
                 NaN
                        Sunday
                                                    NaN
      2
                           NaN
                                                    NaN
                 NaN
                                                                          NaN
      3
                 NaN
                        Sunday
                                                    NaN
                                                                          1.0
      4
                                                                          1.0
                 NaN
                       Friday
                                                    NaN
        Q12: MEDIA [ESPN] Q12: MEDIA [Yahoo] Click Coordinates (x, y)
      0
                       NaN
                                           NaN
                                                                     NaN
                       NaN
                                                                (84, 25)
      1
                                           NaN
      2
                       NaN
                                           NaN
                                                                     NaN
      3
                       NaN
                                           NaN
                                                                (75, 23)
      4
                                                                (70, 10)
                       NaN
                                           NaN
      [5 rows x 120 columns]
[30]: #before doing grouping, will quickly fix the missing data issue & data quality,
       \rightarrow issue as below
      # filter the records which contans all N.A
      candy_2017_df_filter_na_only = candy_2017_df.dropna(how='all')
      #Fill in missing data fill in the NaN values by using ffill
      candy_2017_df_ffill = candy_2017_df_filter_na_only.fillna(method='ffill')
      #Fill in missing data fill in the NaN values by using ffill
      candy_2017_df_bfill = candy_2017_df_ffill.fillna(method='bfill')
      #Fill in missing data fill in the NaN values by O
      candy_2017_df_filldata = candy_2017_df_bfill.fillna(0)
      # transforming the country name to country code
      candy 2017 df filldata['Q4: COUNTRY'] = candy 2017 df filldata['Q4: COUNTRY'].
       →apply(lambda x: fix_country_name(x))
[31]: candy_2017_df_filldata.head()
         Internal ID Q1: GOING OUT? Q2: GENDER Q3: AGE Q4: COUNTRY
[31]:
            90258773
                                  No
                                            Male
                                                      44
                                                                   US
      0
      1
            90272821
                                  No
                                            Male
                                                      44
                                                                   US
      2
            90272829
                                  No
                                            Male
                                                      49
                                                                   US
      3
            90272840
                                                                   US
                                  No
                                            Male
                                                      40
            90272841
                                  No
                                            Male
                                                      23
                                                                   US
        Q5: STATE, PROVINCE, COUNTY, ETC Q6 | 100 Grand Bar \
      0
                                       NM
                                                          MEH
      1
                                       NM
                                                          MEH
```

Bottom line is Twix is really the only candy w... White and gold

```
2
                           Virginia
                                                    MEH
3
                                                    MEH
                           exton pa
4
                                                    JOY
  Q6 | Anonymous brown globs that come in black and orange wrappers\t(a.k.a.
Mary Janes) \
0
                                               DESPAIR
1
                                               DESPAIR
2
                                               DESPAIR
3
                                               DESPAIR
4
                                               DESPAIR
  Q6 | Any full-sized candy bar Q6 | Black Jacks
0
                             JOY
                                               MEH
1
                             JOY
                                               MEH
2
                             JOY
                                               MEH
3
                             JOY
                                               MEH
4
                             JOY
                                           DESPAIR
                                    Q8: DESPAIR OTHER
0 when the little kids get the big chocolate bar...
1 when the little kids get the big chocolate bar...
2 when the little kids get the big chocolate bar...
3 when the little kids get the big chocolate bar...
4 when the little kids get the big chocolate bar...
                                   Q9: OTHER COMMENTS
                                                            Q10: DRESS \
O Bottom line is Twix is really the only candy w...
                                                      White and gold
1 Bottom line is Twix is really the only candy w... White and gold
2 Bottom line is Twix is really the only candy w... White and gold
3
                               Raisins can go to hell White and gold
4
                               Raisins can go to hell White and gold
                                         Unnamed: 113 Q11: DAY
   dress (https://survey.ubc.ca/media/assets/user...
                                                       Sunday
  dress (https://survey.ubc.ca/media/assets/user...
                                                       Sunday
2 dress (https://survey.ubc.ca/media/assets/user...
                                                       Sunday
3 dress (https://survey.ubc.ca/media/assets/user...
                                                       Sunday
4 dress (https://survey.ubc.ca/media/assets/user...
                                                       Friday
  Q12: MEDIA [Daily Dish] Q12: MEDIA [Science] Q12: MEDIA [ESPN]
0
                       1.0
                                             1.0
                                                               1.0
                       1.0
                                             1.0
                                                               1.0
1
2
                       1.0
                                             1.0
                                                               1.0
3
                       1.0
                                             1.0
                                                               1.0
4
                       1.0
                                             1.0
                                                               1.0
```

```
0
                      1.0
                                         (84, 25)
                                         (84, 25)
     1
                      1.0
                                         (84, 25)
     2
                      1.0
     3
                      1.0
                                         (75, 23)
                                         (70, 10)
                      1.0
     [5 rows x 120 columns]
[32]: # Grouping with Dicts/Series
     #Hierarchical Indexing
     hir_candy_2017_df = candy_2017_df_filldata.set_index(['Q4: COUNTRY','Q2:u

GENDER'])
[33]: mapping_media= {'Q12: MEDIA [Daily Dish]':'web', 'Q12: MEDIA [Science]':
      [34]: a= hir_candy_2017_df.groupby(mapping_media, axis=1)
[35]: a.sum().head()
[35]:
                             tv web
     Q4: COUNTRY Q2: GENDER
     US
                 Male
                            2.0 2.0
                 Male
                            2.0 2.0
                 Male
                            2.0 2.0
                 Male
                            2.0 2.0
                 Male
                            2.0 2.0
[36]: #Grouping with Functions
     a1 = hir_candy_2017_df.groupby(len).sum()
[37]: a1.head()
[37]:
         Internal ID Q12: MEDIA [Daily Dish] Q12: MEDIA [Science] \
     2 222089196038
                                      2460.0
                                                           2460.0
        Q12: MEDIA [ESPN] Q12: MEDIA [Yahoo]
     2
                   2460.0
                                      2460.0
[38]: # pivot table
     data1 = hir_candy_2017_df.pivot_table(index='Q4: COUNTRY', columns='Q2:u
      →GENDER', values='Q3: AGE', aggfunc=sum)
     data1.head()
[38]: Q2: GENDER
                        Female I'd rather not say Male Other
     Q4: COUNTRY
     ΑU
                 Q3: AGE
                            84
                                             NaN
                                                   73
                                                        NaN
```

Q12: MEDIA [Yahoo] Click Coordinates (x, y)

```
CH
                   Q3: AGE
                                36
                                                     30
                                                           45
                                                                 NaN
                   Q3: AGE
      CN
                                 11
                                                     NaN
                                                           59
                                                                 NaN
      CR
                   Q3: AGE
                               NaN
                                                     NaN
                                                           40
                                                                 NaN
[39]: #Cross Tabs
      #pd.crosstab()
      pd.crosstab(data1.Female, data1.Male)
[39]: Male
                    34
               32
                          45
                                46
                                     59
                                          73
                                                119
                                                      229
                                                           236
                                                                 345
      Female
      11
                 0
                       0
                            0
                                  0
                                       1
                                             0
                                                  0
                                                        0
                                                             0
                                                                   0
      19
                 0
                       1
                            0
                                  0
                                       0
                                             0
                                                  0
                                                        0
                                                             0
                                                                   0
      35
                 0
                       0
                            0
                                  1
                                       0
                                             0
                                                  0
                                                        0
                                                             0
                                                                   0
      36
                 0
                       0
                                  0
                                       0
                                             0
                                                  0
                                                        0
                                                             0
                                                                   0
                            1
      49
                 0
                       0
                            0
                                  0
                                       0
                                             0
                                                  0
                                                        0
                                                             1
                                                                   0
                 0
                                                                   0
      51
                       0
                            0
                                  0
                                       0
                                             0
                                                  1
                                                        0
                                                             0
      69
                       0
                                             0
                                                                   0
                 0
                            0
                                  0
                                       0
                                                  0
                                                        1
                                                             0
      84
                 0
                       0
                            0
                                  0
                                       0
                                             1
                                                  0
                                                        0
                                                             0
                                                                   0
      119
                       0
                            0
                                  0
                                       0
                                             0
                                                  0
                                                        0
                                                             0
                                                                   0
                 1
      140
                       0
                                  0
                                             0
                                                             0
                 0
                            0
                                       0
                                                  0
                                                                   1
     Chapter 11
[40]: # read CANDY-HIERARCHY-2015-SURVEY-Responses source file into dataframe- for
       ⇔chapter 7
      ts_candy_df = pd.read_excel (r"C:/Users/dell/Documents/docker/Weeks7&8Data/
       →CANDY-HIERARCHY-2015-SURVEY-Responses.xlsx")
      # display firt 5 records
      ts_candy_df.head(5)
[40]:
                        Timestamp How old are you?
      0 2015-10-23 08:46:20.451
                                                  35
      1 2015-10-23 08:46:51.583
                                                  41
      2 2015-10-23 08:47:34.285
                                                  33
      3 2015-10-23 08:47:58.964
                                                  31
      4 2015-10-23 08:48:11.719
                                                  30
        Are you going actually going trick or treating yourself?
                                                                         [Butterfinger] \
      0
                                                             No
                                                                                     JOY
      1
                                                             Nο
                                                                                     JOY.
      2
                                                             No
                                                                                DESPAIR
      3
                                                                                     JOY
                                                             No
      4
                                                                                    {\tt NaN}
                                                             No
          [100 Grand Bar]
      0
                       NaN
      1
                       JOY
```

NaN

Q3: AGE

CA

```
2
           DESPAIR
3
                JOY
4
                JOY
   [Anonymous brown globs that come in black and orange wrappers] \
0
                                                DESPAIR
1
                                                DESPAIR
2
                                                DESPAIR
3
                                                DESPAIR
4
                                                DESPAIR
   [Any full-sized candy bar]
                                 [Black Jacks]
                                                  [Bonkers]
                                                              [Bottle Caps]
0
                            JOY
                                            NaN
                                                        NaN
                                                                        NaN
                            JOY
                                        DESPAIR
                                                    DESPAIR
1
                                                                        JOY
2
                            JOY
                                        DESPAIR
                                                    DESPAIR
                                                                    DESPAIR
                            JOY
3
                                        DESPAIR
                                                    DESPAIR
                                                                        JOY
4
                            JOY
                                            NaN
                                                        NaN
                                                                        {\tt NaN}
   [Necco Wafers] Which day do you prefer, Friday or Sunday?
0
               NaN
                                                             NaN
          DESPAIR
                                                             NaN
1
2
          DESPAIR
                                                             NaN
3
          DESPAIR
                                                             NaN
               NaN
                                                             NaN
  Please estimate the degrees of separation you have from the following folks
[Bruce Lee] \
0
                                                     NaN
1
                                                     NaN
2
                                                     {\tt NaN}
3
                                                     NaN
4
                                                     NaN
  Please estimate the degrees of separation you have from the following folks
[JK Rowling] \
0
                                                     NaN
1
                                                     NaN
2
                                                     NaN
3
                                                     NaN
4
                                                     NaN
  Please estimate the degrees of separation you have from the following folks
[Malala Yousafzai] \
0
                                                     NaN
1
                                                     {\tt NaN}
2
                                                     NaN
3
                                                     NaN
```

4 NaN

```
Please estimate the degrees of separation you have from the following folks
[Thom Yorke] \
0
                                                    NaN
1
                                                    NaN
2
                                                    NaN
3
                                                    NaN
4
                                                    NaN
 Please estimate the degrees of separation you have from the following folks
[JJ Abrams] \
0
                                                    NaN
1
                                                    NaN
2
                                                    NaN
3
                                                    NaN
4
                                                    NaN
 Please estimate the degrees of separation you have from the following folks
[Hillary Clinton]
                                                    {\tt NaN}
1
                                                    NaN
2
                                                    NaN
3
                                                    NaN
4
                                                    NaN
 Please estimate the degrees of separation you have from the following folks
[Donald Trump] \
0
                                                    NaN
1
                                                    {\tt NaN}
2
                                                    NaN
3
                                                    NaN
4
                                                    NaN
 Please estimate the degrees of separation you have from the following folks
[Beyoncé Knowles]
0
                                                    NaN
1
                                                    NaN
2
                                                    NaN
3
                                                    NaN
4
                                                    NaN
[5 rows x 124 columns]
```

[41]: from datetime import datetime

```
[42]: # Convert between string and date time
      ts_candy_df['Timestamp'] = pd.to_datetime(ts_candy_df['Timestamp'],_
      ts candy df.head()
[42]:
                      Timestamp How old are you?
      0 2015-10-23 08:46:20.451
      1 2015-10-23 08:46:51.583
                                               41
      2 2015-10-23 08:47:34.285
                                               33
      3 2015-10-23 08:47:58.964
                                               31
      4 2015-10-23 08:48:11.719
                                               30
        Are you going actually going trick or treating yourself?
                                                                    [Butterfinger]
                                                                               JOY
      0
                                                                               JOY
      1
                                                          No
      2
                                                          Nο
                                                                           DESPATE.
      3
                                                          No
                                                                               .JOY
      4
                                                          No
                                                                               NaN
         [100 Grand Bar]
      0
                     NaN
      1
                     JOY
      2
                 DESPAIR
      3
                     JOY
      4
                     JOY
         [Anonymous brown globs that come in black and orange wrappers] \
      0
                                                    DESPAIR
                                                    DESPAIR
      1
      2
                                                    DESPAIR
      3
                                                    DESPAIR
      4
                                                    DESPAIR
                                      [Black Jacks]
                                                      [Bonkers]
                                                                 [Bottle Caps]
         [Any full-sized candy bar]
      0
                                 JOY
                                                NaN
                                                            NaN
                                                                           NaN
      1
                                 JOY
                                            DESPAIR
                                                       DESPAIR
                                                                           JOY
      2
                                 JOY
                                            DESPAIR
                                                       DESPAIR
                                                                       DESPAIR
      3
                                 JOY
                                            DESPAIR
                                                       DESPAIR
                                                                           JOY
                                 JOY
                                                NaN
                                                            NaN
                                                                           NaN
         [Necco Wafers] Which day do you prefer, Friday or Sunday?
      0
                                                                 NaN
                    NaN
      1
                DESPAIR
                                                                 NaN
      2
                DESPAIR
                                                                 NaN
      3
                DESPAIR
                                                                 NaN
                    NaN
                                                                 NaN
```

Please estimate the degrees of separation you [Bruce Lee] \ 0 1 2 3 4	NaN NaN NaN NaN NaN NaN NaN
Please estimate the degrees of separation you [JK Rowling] \ 0 1 2 3 4	have from the following folks NaN NaN NaN NaN NaN
Please estimate the degrees of separation you [Malala Yousafzai] \ 0 1 2 3 4	NaN NaN NaN NaN NaN NaN
Please estimate the degrees of separation you [Thom Yorke] \ 0 1 2 3 4	NaN NaN NaN NaN NaN NaN NaN
Please estimate the degrees of separation you [JJ Abrams] \ 0 1 2 3 4	NaN NaN NaN NaN NaN NaN NaN NaN
Please estimate the degrees of separation you [Hillary Clinton] \ 0 1 2 3 4	NaN NaN NaN NaN NaN

```
Please estimate the degrees of separation you have from the following folks
      [Donald Trump] \
                                                        NaN
      1
                                                        NaN
      2
                                                        NaN
      3
                                                        NaN
      4
                                                        NaN
        Please estimate the degrees of separation you have from the following folks
      [Beyoncé Knowles]
      0
                                                        NaN
      1
                                                        NaN
      2
                                                        NaN
      3
                                                        NaN
      4
                                                        NaN
      [5 rows x 124 columns]
[43]: #Generate date range
      pd.date_range('2015-10-31', periods=10)
[43]: DatetimeIndex(['2015-10-31', '2015-11-01', '2015-11-02', '2015-11-03',
                     '2015-11-04', '2015-11-05', '2015-11-06', '2015-11-07',
                     '2015-11-08', '2015-11-09'],
                    dtype='datetime64[ns]', freq='D')
[44]: #Frequencies and date offsets
      pd.date_range('2015-10-31', periods=10, freq='30min')
[44]: DatetimeIndex(['2015-10-31 00:00:00', '2015-10-31 00:30:00',
                     '2015-10-31 01:00:00', '2015-10-31 01:30:00',
                     '2015-10-31 02:00:00', '2015-10-31 02:30:00',
                     '2015-10-31 03:00:00', '2015-10-31 03:30:00',
                     '2015-10-31 04:00:00', '2015-10-31 04:30:00'],
                    dtype='datetime64[ns]', freq='30T')
[45]: #Convert timestamps to periods and back
      ts_candy_df['Timestamp'] = ts_candy_df['Timestamp'].dt.to_period('M')
      ts_candy_df['Timestamp'].head()
[45]: 0
           2015-10
           2015-10
      1
      2
           2015-10
      3
           2015-10
      4
           2015-10
      Name: Timestamp, dtype: period[M]
```

[]: