3. Handling Missing Data and Multi Index

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1 3.1 Missing Data

Let's show a few convenient methods to deal with Missing Data in pandas:

```
[2]: import numpy as np
     import pandas as pd
[3]: df = pd.DataFrame([[5, 2, 7, 0],
                          [3, 4, 4, 1],
                          [np.nan, np.nan, 4, 5],
                          [4, 3, 1, 4]],
                          columns=list('ABCD'))
[4]: print(df)
         Α
               В
                 С
                    D
    0
       5.0
            2.0
                  7
       3.0
            4.0
    1
                     1
    2
       {\tt NaN}
            NaN
                    5
       4.0
            3.0
                  1 4
[5]: df.dropna()
[5]:
          Α
               В
                  С
                    D
            2.0
     0 5.0
                  7
        3.0
            4.0
        4.0 3.0 1
[6]: df.fillna(5)
[6]:
          Α
               В
                  С
                     D
        5.0
             2.0
                  7
        3.0 4.0
     1
     2 5.0
             5.0
       4.0
             3.0
                  1
[8]: df = pd.DataFrame({'A':[1,2,np.nan],
                        'B': [5, np.nan, np.nan],
```

```
'C':[1,2,3]})
 [9]: df
 [9]:
            Α
                 В
                     C
          1.0
               5.0
                     1
          2.0
                     2
      1
               NaN
      2
         NaN
               NaN
                     3
[10]: df.dropna()
[10]:
            Α
                     C
         1.0
               5.0
[11]:
      df.dropna(axis=1)
[11]:
          С
          1
      0
          2
      1
      2
          3
      thresh=2 Keep only the rows with at least 2 non-NA values.
     df.dropna(thresh=2)
[15]:
[15]:
            Α
                  В
                     C
          1.0
               5.0
                     1
               {\tt NaN}
          2.0
 []: df.fillna(value='FILL VALUE')
 [4]:
      df['A'].fillna(value=df['A'].mean())
 [4]: 0
            5.0
      1
            3.0
      2
            4.0
      3
            4.0
      Name: A, dtype: float64
```

3.2.Multi-Index and Index Hierarchy Let us go over how to work with Multi-Index, first we'll create a quick example of what a MultiIndexed DataFrame would look like: Hierarchical / Multi-level indexing is very exciting as it opens the door to some quite sophisticated data analysis and manipulation, especially for working with higher dimensional data. In essence, it enables you to store and manipulate data with an arbitrary number of dimensions in lower dimensional data structures like Series (1d) and DataFrame (2d). MultiIndex object is the hierarchical analogue of the standard Index object which typically stores the axis labels in pandas objects. You can think of MultiIndex as an array of tuples where each tuple is unique. A MultiIndex can be

created from a list of arrays (using MultiIndex.from_arrays()), an array of tuples (using MultiIndex.from_tuples()), a crossed set of iterables (using MultiIndex.from_product()), or a DataFrame (using MultiIndex.from_frame()). The Index constructor will attempt to return a MultiIndex when it is passed a list of tuples. The following examples demonstrate different ways to initialize MultiIndexes

```
[5]: arrays = [['bar', 'bar', 'baz', 'baz', 'foo', 'foo', 'qux', __
      [6]: tuples = list(zip(*arrays))
 [7]:
     tuples
 [7]: [('bar', 'one'),
      ('bar', 'two'),
      ('baz', 'one'),
      ('baz', 'two'),
      ('foo', 'one'),
      ('foo', 'two'),
      ('qux', 'one'),
      ('qux', 'two')]
 [8]:
      index = pd.MultiIndex.from_tuples(tuples, names=['first', 'second'])
 [9]:
     index
 [9]: MultiIndex(levels=[['bar', 'baz', 'foo', 'qux'], ['one', 'two']],
                codes=[[0, 0, 1, 1, 2, 2, 3, 3], [0, 1, 0, 1, 0, 1, 0, 1]],
                names=['first', 'second'])
[10]: s = pd.Series(np.random.randn(8), index=index)
     s
[10]: first
            second
     bar
                      0.623682
            one
            two
                      1.215149
     baz
                      0.318699
            one
            two
                     -0.108762
     foo
            one
                      1.721548
                      0.227038
            two
                     -0.224594
     qux
            one
                      1.398901
            two
     dtype: float64
[12]: hier_index
[12]: MultiIndex(levels=[['G1', 'G2'], [1, 2, 3]],
                codes=[[0, 0, 0, 1, 1, 1], [0, 1, 2, 0, 1, 2]])
```

```
[28]: s.index.names
[28]: FrozenList(['first', 'second'])
[30]: #updating ther index names
      s.index.names = ['Name1','Name2']
[31]: print(s)
     Name1
            Name2
     bar
             one
                      0.623682
             two
                      1.215149
                      0.318699
     baz
             one
                     -0.108762
             two
     foo
                      1.721548
             one
             two
                      0.227038
     qux
             one
                     -0.224594
             two
                      1.398901
     dtype: float64
     3.3 Data Frame XS
     DataFrame.xs(self, key, axis=0, level=None, drop level=True) Return cross-section from the Se-
     ries/DataFrame. This method takes a key argument to select data at a particular level of a Multi-
     Index
[20]: import pandas as pd
      d = {'num_legs': [4, 4, 2, 2],
      'num_wings': [0, 0, 2, 2],
      'class': ['mammal', 'mammal', 'mammal', 'bird'],
      'animal': ['cat', 'dog', 'bat', 'penguin'],
      'locomotion': ['walks', 'walks', 'flies', 'walks']}
[21]: df = pd.DataFrame(data=d)
[22]: df = df.set_index(['class', 'animal', 'locomotion'])
[23]: df
[23]:
                                  num_legs num_wings
      class
             animal locomotion
      mammal cat
                      walks
                                          4
                                                      0
             dog
                      walks
                                          4
                                                      0
                                                      2
                                          2
             bat
                      flies
                                                      2
             penguin walks
                                          2
      bird
```

[24]: df.xs('mammal')

2 Good Job