

DataEng S22: Data Transformation

In-Class Assignment

Submit: Make a copy of this document and use it to record your results. Store a PDF copy of the document in your git repository along with any needed code. Submit the [in-class activity submission form](#) by Friday at 5:00 pm.

Initial Discussion Questions

Discuss the following questions among your working group members at the beginning of the week and place your own response (or that of your group members) into this space. Be sure to mark each response as either your own or that of the group (both types of responses are welcome)

In the lecture we mentioned the benefits of Data Transformation, but can you think of any problems that might arise with Data Transformation?

Do you think data transformation or validation should come first in your pipeline? Why or why not?

ETL (Extract, Transform, Load) is a common pipeline process. Describe the delineation of each of these separate activities. For example, how is extraction different from transformation?

Vincent:

1. The data after transformation might make sense for ourself but noit others.
2. Yes, cause that might reduce the work after the data pipeline
3. Extract is dropping data we don't need, or keep the data we need. Transform is when we are changing the data from one format to another. Load is when we are moving the data from one system to another

Group:

Leshi:

1. 0Leshi: Data Inconsistencies and resource-intensive.
2. Leshi: I do think data transformation or validation should come first so we can better organize the data when we put the data into the pipeline.
3. Extracting data simply means extracting the raw data by structured or unstructured. Transform data mean we need to do a series of actions to clean, and filter data to have a better version of the data set. Load data mean moving the data set after being transformed into a target data warehouse.

Pandas Review

Recall in Week 2: Data Gathering, recall that we introduced several table-level pandas methods:

- `df.drop()`
- `df.dropna(axis=0, how='any')`
- `df.rename(columns=newColumns)`
- `df.concat([df1, df2])`

Additionally during week 2, we performed data cleaning at the cell level, by accessing cell data as strings with the `df[0].str` attribute. This attribute allows us to apply standard python string operations on the cells of the dataframe, like `.split()` `.contains()` `.replace()` `.capitalize()` etc.

These are actually all types of data transformations! Each of these methods can be used to clean, fix, and repackage the data as needed.

Explore the activity below to learn about more complex transformations. To encourage you to explore the pandas methods available, we have not told you which methods to use in all the cases. Use the examples above to consider what other methods may exist. For example we already know about `drop`, does `insert` exist? How can you find more information about a method's arguments or examples of usage?

Keep in mind these handy methods which give you more information about your dataframe:

- `df.head()`
- `df.tail()`
- `df.info()`
- `df.shape`
- `df.describe(include=[np.number])`
- `type(df)`
- `type(df['columnName'])`

If you want more general practice with pandas, consider running through the W3 tutorial linked below. It includes examples, documentation, exercises, and quizzes to help you feel comfortable working with pandas: <https://www.w3schools.com/python/pandas/default.asp>

A. Filtering

We'll be using this book dataset from the British Library: [link](#)

Use python and pandas to filter this data by dropping these columns: **Edition**, **Statement**, **Corporate Author**, **Corporate Contributors**, **Former owner**, **Engraver**, **Issuance type**, **Shelfmarks**

Do this two ways. First use the DataFrame `drop()` method. Then do the same with the `usecols` argument of `pandas.read_csv()`

Hint: are you dropping rows or columns? Is there an argument for that in the drop method? What types of values does the `usecols` argument expect?

```
import pandas as pd
import numpy as np

data = pd.read_csv('books.csv', usecols = ['Identifier', 'Place of Publication', 'Date of Publication',
                                           'Publisher', 'Title', 'Author', 'Contributors', 'Flickr URL'])
df = pd.read_csv('books.csv')
df = pd.DataFrame(df)
df = df.drop(columns = ['Edition Statement', 'Corporate Author', 'Corporate Contributors', 'Former owner',
                       'Engraver', 'Issuance type', 'Shelfmarks'])
print(data)
```

B. Tidying Up the Data

In the book data, notice that the “Date of Publication” column has many inconsistencies. Update all of the data in this column to be consistent four digit year values. Specifically,

- Remove the extra dates in square brackets, wherever present: e.g., 1879 [1878] should be converted to 1879
- Convert date ranges to their “start date”: e.g., 1860-63; 1839, 38-54
- Remove uncertain dates and replace them with NumPy’s NaN: [1897?]
- Convert the string nan to NumPy’s NaN value
- Finally, update the type of the “Date of Publication” column to be numeric (not string, not object)

The “Place of Publication” column of this data set is also untidy. Transform all of the values in this column to be only the name of the city. If the city name is not found in the string, then the name of the country. If neither are present then transform to the string “unknown”.

```
place = data['Place of Publication']
london = place.str.contains('London')
oxford = place.str.contains('Oxford')
data['Place of Publication'] = np.where(london, 'London',
                                       np.where(oxford, 'Oxford',
                                       place.str.replace('-', ' ')))

place = data['Place of Publication'].str.extract(r'^([\S]+)', expand = False)
print(data)
```

C. Tidying with applymap()

See this list of USA towns that have universities: [uniplaces.txt](#). This data was originally created for another purpose and contains artifacts of that. For example it is alphabetized by the name of the state where the university is located. The state is listed once and then the universities present in that state are listed on the lines below. Additionally there are extra punctuation marks to designate separation of the town and the university name (,), and an artifact number at the end [2]. We would like to change the data to have 3 columns containing the state, city, and university.

```
9 def get(item):
10     if '(' in item:
11         return item[:item.find(' (')]
12     elif '[' in item:
13         return item[:item.find('[')]
14     elif ')' in item:
15         return item[item.find('('):]
16     else:
17         return item
18
19 towns = []
20 with open('uniplaces.txt') as file:
21     for line in file:
22         if '[edit]' in line:
23             state = line
24         else:
25             line.split(' ')
26             city = line.split(' ')[0]
27             uni = re.findall('\(.*?\)', line)
28             towns.append((state, city, uni))
29
30 df = pd.DataFrame(towns, columns=['State', 'City', 'University'] )
31
32
33 df = df.applymap(get)
34 print(df)
```

Task:

Use the [applymap\(\) method](#) to apply a custom function to the data. This should transform it into a tidy list of city, town, and university. Details below.

Task Details

There are a lot of examples you can find for how to use `applymap()`. [This example from Geeks4geeks](#) uses a lambda function. A lambda function in python is a simple function that can be accomplished in one line. The method `applymap()` then applies that function to each row of the dataframe. Therefore `df.applymap(lambda x: len(str(x)))` will operate on the dataframe called `df`. For each element of each row of `df`, it applies the lambda function, naming the element `x`. This lambda function finds the length of `x`.

In python you can pass functions as arguments to another function. In this example below, you can choose to emphasize your text by either shouting it or whispering it, depending on which function you pass to `emphasize()`.

```
>>> def shout(text):
...     return text.upper()
...
>>> def whisper(text):
...     return text.lower()
...
>>> def emphasize(myfunc, s):
...     if s[0:5] == 'Hello':
...         return myfunc(s[0:5]) + s[5:]
...     return s
...
>>> emphasize(shout, "Hello World!")
'HELLO World!'
>>> emphasize(whisper, "Hello World!")
'hello World!'
```

In our `applymap()` example above, we applied a lambda function to each row of the dataframe. Instead, you can apply your own custom function.

The method `applymap()` takes a function as input and applies it to the dataframe it is called on. Write a custom function which handles the `uniplaces.txt` data and reformats it as 3 columns for state, city, university.

Hint: first create a dataframe from this data, with the desired columns. Then use `applymap` to clean out the extra artifacts

D. Decoding

Similar to C-Tran, TriMet also produces breadcrumb data for its buses. Here is a sample for one bus on one day of October 2021: [link to breadcrumb data](#)

One column of the TriMet breadcrumb data is called "OCCURRENCES". Our contact at TriMet explained this field as follows:

OCCURRENCES – number of times a point appeared in the dataset. This is to clean up some of the data because sometimes when the vehicle is stationary it will replicate multiple instances at the same point. This consolidates those into a single record.

This encoding of multiple breadcrumbs into a single record helps to save space, but for analysis we typically need to decode it so that all of the records can be analyzed. Often decoding consists of exploding one row out into multiple rows.

Your job is to decode records with OCCURRENCES > 1 into replicated records in a DataFrame. So for example, a sequence of records like this:

```
4313660399,03411,B,29OCT2021:08:36:17,29OCT2021:00:00:00,30977,-122.844715,45.503493,0,223428.48,8,12,0.7,1,Y,
TRANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30982,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660401,03411,B,29OCT2021:08:36:57,29OCT2021:00:00:00,31017,-122.844858,45.503212,5,223533.47,10,10,1.3,2,
Y,TRANS,31OCT2021:06:06:40
```

Should be expanded to a sequence of records like this:

```
4313660399,03411,B,29OCT2021:08:36:17,29OCT2021:00:00:00,30977,-122.844715,45.503493,0,223428.48,8,12,0.7,1,Y,
TRANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30982,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30987,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30992,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30997,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,31002,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30907,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660400,03411,B,29OCT2021:08:36:22,29OCT2021:00:00:00,30912,-122.8448,45.503335,32,223487.54,8,11,0.7,9,Y,T
RANS,31OCT2021:06:06:40
4313660401,03411,B,29OCT2021:08:36:57,29OCT2021:00:00:00,31017,-122.844858,45.503212,5,223533.47,10,10,1.3,2,
Y,TRANS,31OCT2021:06:06:40
4313660401,03411,B,29OCT2021:08:36:57,29OCT2021:00:00:00,31022,-122.844858,45.503212,5,223533.47,10,10,1.3,2,
Y,TRANS,31OCT2021:06:06:40
```

This is because the second breadcrumb in the example (4313660400) has an OCCURRENCES value of 9. Note that for this exercise it is OK to duplicate the 3VEH13660400

After you have expanded out the multiple rows, be sure to clean up the dataframe if necessary. It should have the same number of columns that you started with, in the same order, and they should all be named the same as when we started.

Hint: How can you decode a row into multiple rows in pandas? While it may be tempting to try to iterate through the dataframe and append new rows, instead consider table-level pandas methods that you can use. If any DataFrame methods you want to use are not available on a Series, is there an equivalent method for the Series?

E. Filling

The TriMet data, linked above, is missing some values in the VALID_FLAG column. Use the [`pandas.DataFrame.ffill\(\)`](#) method to fill in the missing data.

Hint: How can you check for bad data like NaN or duplicates in a DataFrame? How can you find all the unique values in a column? For a column named like VALID_FLAG, what do you think are the expected values?

F. Interpolating

The TriMet breadcrumb data, linked above, is missing some values in the ARRIVE_TIME column. Use the [`pandas.DataFrame.interpolate\(\)`](#) method to fill in the missing time data. The interpolate method fills in NAN values in a pandas DataFrame or Series. There are many different methods of interpolation that you can specify for different use cases. Be sure to use the 'linear' interpolation method which fills in the value based on previous values, ignoring the index, and equally spacing the missing values.

Hint: What is the frequency of the bus datapoints? Do we expect them every minute, every few seconds, etc? Does interpolate achieve this automatically? If not, how can you adjust it to do so?

Could you have used the `interpolate()` method for problem E above?

G. More Transformations

If you have finished all the previous transformations, try out those listed on this guide: <https://towardsdatascience.com/8-ways-to-transform-pandas-dataframes-b8c168ce878f>

For a longer guide on `melt` with a larger dataset:

<https://towardsdatascience.com/transforming-data-in-python-with-pandas-melt-854221daf507>

H. Transformation Visualizations

You can also visualize your data transformations with tools like: <https://pandastutor.com/vis.html>

Note however that you should provide a small sample of data like in the example they provide:

```
csv = '''
breed,type,longevity,size,weight
German Shepherd,herding,9.73,large,
Beagle,hound,12.3,small,
...
Maltese,toy,12.25,small,5.0
'''
```

You can then utilize this in your code as normal:

```
df = pd.read_csv(csv)
```

I. Transformation Visualizations

This activity will be filled in for Wednesday.