Extract, Transform & Load on AWS platform using Python with AWS Data Wrangler

Data contains list of restaurants and their menus in USA partnered with Uber Eats.

Dataset has 2 csv files-

- 1) restaurants.csv
- 2) restaurants-menus.csv

Following task will be performed on the data:

Part A - AWS services

- 1) Create bucket in Amazon S3 and create 2 folders raw data & cleaned data. Upload the files in raw data.
- 2) Create dataset in Amazon Glue.
- 3) Create notebook instance in Amazon Sagemaker.
- 4) Using IAM, add policies in IAM role created in Sagemaker notebook that allows to access S3 bucket, Glue database and Athena.

Part B - Using python on Jupyter platform

- 1) Open Jupyter platform from Sagemaker notebook.
- 2) Install AWS Data Wrangler service. Fetch the raw data.
- 3) Using Pandas and NumPy in python, perform data cleaning operation.
- 4) Store the cleaned data in the bucket-folder cleaned files with the help of created database in Amazon Glue.
- 5) To find out insights from restaurant database, write query using query function from AWS Athena in AWS Sagemaker.

Install AWS Data Wrangler

In [1]: ! pip install awswrangler

```
Looking in indexes: https://pypi.org/simple, https://pip.repos.neuron.amazona
ws.com
Collecting awswrangler
 Downloading awswrangler-2.16.1-py3-none-any.whl (248 kB)
                                 248.6/248.6 KB 4.9 MB/s eta 0:0
0:00a 0:00:01
Collecting numpy<2.0.0,>=1.21.0
 Downloading numpy-1.23.3-cp38-cp38-manylinux_2_17_x86_64.manylinux2014_x86_
64.whl (17.1 MB)
                                       ----- 17.1/17.1 MB 29.9 MB/s eta 0:0
0:0000:0100:01
Requirement already satisfied: pandas<2.0.0,>=1.2.0 in /home/ec2-user/anacond
a3/envs/python3/lib/python3.8/site-packages (from awswrangler) (1.3.4)
Collecting requests-aws4auth<2.0.0,>=1.1.1
 Downloading requests_aws4auth-1.1.2-py2.py3-none-any.whl (24 kB)
Requirement already satisfied: boto3<2.0.0,>=1.20.17 in /home/ec2-user/anacon
da3/envs/python3/lib/python3.8/site-packages (from awswrangler) (1.24.72)
Collecting gremlinpython<4.0.0,>=3.5.2
 Downloading gremlinpython-3.6.1-py2.py3-none-any.whl (73 kB)
                                     73.3/73.3 KB 18.4 MB/s eta 0:0
0:00
Collecting backoff<3.0.0,>=1.11.1
 Downloading backoff-2.1.2-py3-none-any.whl (14 kB)
Collecting redshift-connector<2.1.0,>=2.0.889
 Downloading redshift connector-2.0.908-py3-none-any.whl (112 kB)
                                    112.0/112.0 KB 26.9 MB/s eta 0:0
0:00
Collecting pymysql<2.0.0,>=1.0.0
 Downloading PyMySQL-1.0.2-py3-none-any.whl (43 kB)
                                          43.8/43.8 KB 11.3 MB/s eta 0:0
0:00
Collecting progressbar2<5.0.0,>=4.0.0
 Downloading progressbar2-4.0.0-py2.py3-none-any.whl (26 kB)
Collecting jsonpath-ng<2.0.0,>=1.5.3
 Downloading jsonpath ng-1.5.3-py3-none-any.whl (29 kB)
Collecting opensearch-py<2.0.0,>=1.0.0
 Downloading opensearch py-1.1.0-py2.py3-none-any.whl (207 kB)
                                      207.5/207.5 KB 40.7 MB/s eta 0:0
0:00
Requirement already satisfied: pyarrow<7.1.0,>=2.0.0 in /home/ec2-user/anacon
da3/envs/python3/lib/python3.8/site-packages (from awswrangler) (7.0.0)
Requirement already satisfied: botocore<2.0.0,>=1.23.17 in /home/ec2-user/ana
conda3/envs/python3/lib/python3.8/site-packages (from awswrangler) (1.24.19)
Requirement already satisfied: openpyxl<3.1.0,>=3.0.0 in /home/ec2-user/anaco
nda3/envs/python3/lib/python3.8/site-packages (from awswrangler) (3.0.9)
Collecting pg8000<2.0.0,>=1.20.0
 Downloading pg8000-1.29.1-py3-none-any.whl (34 kB)
Collecting botocore<2.0.0,>=1.23.17
 Downloading botocore-1.27.75-py3-none-any.whl (9.1 MB)
                                         --- 9.1/9.1 MB 33.3 MB/s eta 0:00:0
0:00:0100:01
Requirement already satisfied: jmespath<2.0.0,>=0.7.1 in /home/ec2-user/anaco
nda3/envs/python3/lib/python3.8/site-packages (from boto3<2.0.0,>=1.20.17->aw
swrangler) (0.10.0)
Requirement already satisfied: s3transfer<0.7.0,>=0.6.0 in /home/ec2-user/ana
```

```
conda3/envs/python3/lib/python3.8/site-packages (from boto3<2.0.0,>=1.20.17->
awswrangler) (0.6.0)
Requirement already satisfied: urllib3<1.27,>=1.25.4 in /home/ec2-user/anacon
da3/envs/python3/lib/python3.8/site-packages (from botocore<2.0.0,>=1.23.17->
awswrangler) (1.26.8)
Requirement already satisfied: python-dateutil<3.0.0,>=2.1 in /home/ec2-user/
anaconda3/envs/python3/lib/python3.8/site-packages (from botocore<2.0.0,>=1.2
3.17 - \text{>awswrangler}) (2.8.2)
Collecting isodate<1.0.0,>=0.6.0
 Downloading isodate-0.6.1-py2.py3-none-any.whl (41 kB)
                                           41.7/41.7 KB 1.0 MB/s eta 0:00:
00
Collecting aenum<4.0.0,>=1.4.5
 Downloading aenum-3.1.11-py3-none-any.whl (131 kB)
                                131.5/131.5 KB 30.3 MB/s eta 0:0
0:00
Requirement already satisfied: aiohttp<=3.8.1,>=3.8.0 in /home/ec2-user/anaco
nda3/envs/python3/lib/python3.8/site-packages (from gremlinpython<4.0.0,>=3.
5.2->awswrangler) (3.8.1)
Requirement already satisfied: nest-asyncio in /home/ec2-user/anaconda3/envs/
python3/lib/python3.8/site-packages (from gremlinpython<4.0.0,>=3.5.2->awswra
ngler) (1.5.1)
Requirement already satisfied: decorator in /home/ec2-user/anaconda3/envs/pyt
hon3/lib/python3.8/site-packages (from jsonpath-ng<2.0.0,>=1.5.3->awswrangle
r) (5.1.0)
Requirement already satisfied: ply in /home/ec2-user/anaconda3/envs/python3/l
ib/python3.8/site-packages (from jsonpath-ng<2.0.0,>=1.5.3->awswrangler) (3.1
Requirement already satisfied: six in /home/ec2-user/anaconda3/envs/python3/l
ib/python3.8/site-packages (from jsonpath-ng<2.0.0,>=1.5.3->awswrangler) (1.1
6.0)
Requirement already satisfied: et-xmlfile in /home/ec2-user/anaconda3/envs/py
thon3/lib/python3.8/site-packages (from openpyxl<3.1.0,>=3.0.0->awswrangler)
 (1.0.1)
Requirement already satisfied: certifi in /home/ec2-user/anaconda3/envs/pytho
n3/lib/python3.8/site-packages (from opensearch-py<2.0.0,>=1.0.0->awswrangle
r) (2021.10.8)
Requirement already satisfied: pytz>=2017.3 in /home/ec2-user/anaconda3/envs/
python3/lib/python3.8/site-packages (from pandas<2.0.0,>=1.2.0->awswrangler)
 (2021.3)
Collecting scramp>=1.4.1
 Downloading scramp-1.4.1-py3-none-any.whl (8.5 kB)
Collecting python-utils>=3.0.0
  Downloading python utils-3.3.3-py2.py3-none-any.whl (23 kB)
Requirement already satisfied: requests<2.28.1,>=2.23.0 in /home/ec2-user/ana
conda3/envs/python3/lib/python3.8/site-packages (from redshift-connector<2.1.
0, >= 2.0.889 - awswrangler) (2.26.0)
Requirement already satisfied: beautifulsoup4<5.0.0,>=4.7.0 in /home/ec2-use
r/anaconda3/envs/python3/lib/python3.8/site-packages (from redshift-connector
\langle 2.1.0, \rangle = 2.0.889 - awswrangler) (4.10.0)
Requirement already satisfied: packaging in /home/ec2-user/anaconda3/envs/pyt
hon3/lib/python3.8/site-packages (from redshift-connector<2.1.0,>=2.0.889->aw
swrangler) (21.3)
Requirement already satisfied: lxml>=4.6.5 in /home/ec2-user/anaconda3/envs/p
ython3/lib/python3.8/site-packages (from redshift-connector<2.1.0,>=2.0.889->
```

awswrangler) (4.8.0)

```
Requirement already satisfied: frozenlist>=1.1.1 in /home/ec2-user/anaconda3/
envs/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=3.8.0->gremli
npython<4.0.0,>=3.5.2->awswrangler) (1.2.0)
Requirement already satisfied: multidict<7.0,>=4.5 in /home/ec2-user/anaconda
3/envs/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=3.8.0->grem
linpython\langle 4.0.0, \rangle = 3.5.2 - \rangle awswrangler) (5.2.0)
Requirement already satisfied: attrs>=17.3.0 in /home/ec2-user/anaconda3/env
s/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=3.8.0->gremlinpy
thon<4.0.0,>=3.5.2->awswrangler) (21.2.0)
Requirement already satisfied: aiosignal>=1.1.2 in /home/ec2-user/anaconda3/e
nvs/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=3.8.0->gremlin
python<4.0.0,>=3.5.2->awswrangler) (1.2.0)
Requirement already satisfied: async-timeout<5.0,>=4.0.0a3 in /home/ec2-user/
anaconda3/envs/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=3.
8.0->gremlinpython<4.0.0,>=3.5.2->awswrangler) (4.0.1)
Requirement already satisfied: charset-normalizer<3.0,>=2.0 in /home/ec2-use
r/anaconda3/envs/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=
3.8.0->gremlinpython<4.0.0,>=3.5.2->awswrangler) (2.0.8)
Requirement already satisfied: yarl<2.0,>=1.0 in /home/ec2-user/anaconda3/env
s/python3/lib/python3.8/site-packages (from aiohttp<=3.8.1,>=3.8.0->gremlinpy
thon<4.0.0,>=3.5.2->awswrangler) (1.7.2)
Requirement already satisfied: soupsieve>1.2 in /home/ec2-user/anaconda3/env
s/python3/lib/python3.8/site-packages (from beautifulsoup4<5.0.0,>=4.7.0->red
shift-connector<2.1.0,>=2.0.889->awswrangler) (2.3)
Requirement already satisfied: idna<4,>=2.5 in /home/ec2-user/anaconda3/envs/
python3/lib/python3.8/site-packages (from requests<2.28.1,>=2.23.0->redshift-
connector\langle 2.1.0, \rangle = 2.0.889 - \rangleawswrangler) (3.1)
Requirement already satisfied: asn1crypto>=1.4.0 in /home/ec2-user/anaconda3/
envs/python3/lib/python3.8/site-packages (from scramp>=1.4.1->pg8000<2.0.0,>=
1.20.0->awswrangler) (1.4.0)
Requirement already satisfied: pyparsing!=3.0.5,>=2.0.2 in /home/ec2-user/ana
conda3/envs/python3/lib/python3.8/site-packages (from packaging->redshift-con
nector<2.1.0,>=2.0.889->awswrangler) (3.0.6)
Requirement already satisfied: typing-extensions>=3.6.5 in /home/ec2-user/ana
conda3/envs/python3/lib/python3.8/site-packages (from async-timeout<5.0,>=4.
0.0a3->aiohttp<=3.8.1,>=3.8.0->gremlinpython<4.0.0,>=3.5.2->awswrangler) (4.
0.0)
Installing collected packages: aenum, scramp, python-utils, pymysql, opensear
ch-py, numpy, jsonpath-ng, isodate, backoff, requests-aws4auth, progressbar2,
pg8000, botocore, gremlinpython, redshift-connector, awswrangler
 Attempting uninstall: numpy
    Found existing installation: numpy 1.20.3
    Uninstalling numpy-1.20.3:
      Successfully uninstalled numpy-1.20.3
 Attempting uninstall: botocore
    Found existing installation: botocore 1.24.19
    Uninstalling botocore-1.24.19:
      Successfully uninstalled botocore-1.24.19
ERROR: pip's dependency resolver does not currently take into account all the
packages that are installed. This behaviour is the source of the following de
pendency conflicts.
daal4py 2021.3.0 requires daal==2021.2.3, which is not installed.
sagemaker-pyspark 1.4.5 requires pyspark==3.3.0, but you have pyspark 3.0.0 w
hich is incompatible.
numba 0.54.1 requires numpy<1.21,>=1.17, but you have numpy 1.23.3 which is i
ncompatible.
```

awscli 1.25.73 requires botocore==1.27.72, but you have botocore 1.27.75 which is incompatible.

aiobotocore 2.0.1 requires botocore<1.22.9,>=1.22.8, but you have botocore 1. 27.75 which is incompatible.

Successfully installed aenum-3.1.11 awswrangler-2.16.1 backoff-2.1.2 botocore -1.27.75 gremlinpython-3.6.1 isodate-0.6.1 jsonpath-ng-1.5.3 numpy-1.23.3 ope nsearch-py-1.1.0 pg8000-1.29.1 progressbar2-4.0.0 pymysql-1.0.2 python-utils-3.3.3 redshift-connector-2.0.908 requests-aws4auth-1.1.2 scramp-1.4.1 WARNING: You are using pip version 22.0.4; however, version 22.2.2 is availab

le.

You should consider upgrading via the '/home/ec2-user/anaconda3/envs/python3/bin/python -m pip install --upgrade pip' command.

In [3]: !pip install zipfile36

Looking in indexes: https://pypi.org/simple, https://pip.repos.neuron.amazonaws.com

Collecting zipfile36

Downloading zipfile36-0.1.3-py3-none-any.whl (20 kB)

Installing collected packages: zipfile36

Successfully installed zipfile36-0.1.3

WARNING: You are using pip version 22.0.4; however, version 22.2.2 is availab le.

You should consider upgrading via the '/home/ec2-user/anaconda3/envs/python3/bin/python -m pip install --upgrade pip' command.

Import Libraries

```
In [4]: import awswrangler as wr
import zipfile
```

Read Data

In [15]: r_list.head(1)

Out[15]:

	id	position	name	score	ratings	category	price_range	full_address	zip_code	<u>l</u> ;
0	1	19	PJ Fresh (224 Daniel Payne Drive)	NaN	NaN	Burgers, American, Sandwiches	\$	224 Daniel Payne Drive, Birmingham, AL, 35207	35207	33.5623€

```
In [16]: r_menu.head(1)

Out[16]: restaurant_id category name description price

1 Extra Large Pizza Extra Large Meat Lovers Whole pie. 15.99 USD
```

Delete unneccesary columns

```
r_list.drop(columns=['position','score','ratings'],inplace=True)
In [17]:
           r_list.head(1)
In [18]:
Out[18]:
               id
                                                           full_address
                       name
                                 category
                                           price_range
                                                                        zip_code
                                                                                        lat
                                                                                                   Ing
                    PJ Fresh
                                                       224 Daniel Payne
                                  Burgers,
                  (224 Daniel
                                                                 Drive,
               1
                                 American,
                                                     $
                                                                           35207 33.562365 -86.830703
                      Payne
                                                        Birmingham, AL,
                               Sandwiches
                       Drive)
                                                                 35207
           r_menu.drop(columns=['description'],inplace=True)
In [19]:
In [20]:
           r menu.head(1)
Out[20]:
               restaurant_id
                                                            name
                                   category
                                                                       price
            0
                         1 Extra Large Pizza Extra Large Meat Lovers 15.99 USD
```

Renaming columns

```
r_list.rename(columns={'id':'restaurant_id','name':'restaurant_name','full_add
In [21]:
          ress':'address'},inplace=True)
In [22]:
          r_list.head(1)
Out[22]:
              restaurant_id restaurant_name
                                             category
                                                      price_range
                                                                     address zip_code
                                                                                             lat
                                                                   224 Daniel
                              PJ Fresh (224
                                             Burgers,
                                                                      Payne
           0
                                                                                35207 33.562365 -8
                              Daniel Payne
                        1
                                            American,
                                                                       Drive,
                                    Drive) Sandwiches
                                                                  Birmingham,
                                                                    AL, 35207
          r_menu.rename(columns={'category':'menu','name':'dish_name','price':'price_US
In [23]:
          D'},inplace=True)
```

```
In [24]: r_menu.head(1)

Out[24]:

restaurant_id menu dish_name price_USD

1 Extra Large Pizza Extra Large Meat Lovers 15.99 USD
```

Dropping Nan values

In [25]:	r_list.isna().value_counts()									
Out[25]:	restaurant_id lng		restaurant_name	category	price_range	address	zip_code	lat		
	False		False 33399	False	False	False	False	Fal		
	se False		True		False	False	Fal			
			6527		False	True	True	Fal		
		False	172		True	True	True	Fal		
		False	106	True	False	False	False	Fal		
		False	10		True	False	True	Fal		
	se	False	9				False	Fal		
		False pe: int64	4							

Dropping only those rows whose address and zip code is not available

```
In [26]: r_list.dropna(inplace=True)
In [27]: r_list.isna().value_counts()
Out[27]: restaurant_id restaurant_name
                                        category
                                                  price_range address zip_code
         lng
         False
                        False
                                        False
                                                  False
                                                               False
                                                                        False
                                                                                  Fal
         se False
                      33399
         dtype: int64
In [28]: r_menu.isna().value_counts()
Out[28]: restaurant_id menu
                              dish_name
                                         price_USD
         False
                       False False
                                         False
                                                      3375211
         dtype: int64
```

Cleaning Individual Columns and Duplicate values

Restaurant List

Check column: restaurant_name with address,zip_code,lat,lng

Check column : *zip_code* : Considering 5 digit zipcode, the 1st 5 digits were considered as zipcode; for all other cases rows were deleted

```
In [32]: zip = lambda x: x[:5]

list = []

for a in map(zip,r_list['zip_code']):
    try:
        var = int(a)
        list.append(var)
    except ValueError:
        var = ''
        list.append(var)
    r_list['zip_code']=list
```

```
In [33]: r list = r list[r list['zip code']!='']
        r_list['zip_code'] = r_list['zip_code'].astype(int)
         r_list.info()
         <class 'pandas.core.frame.DataFrame'>
        Int64Index: 33377 entries, 0 to 40226
        Data columns (total 8 columns):
             Column
         #
                             Non-Null Count Dtype
             ----
                             -----
         ---
         0
             restaurant_id
                             33377 non-null int64
         1
             restaurant_name 33377 non-null object
                         33377 non-null object
         2
             category
             price_range
         3
                             33377 non-null object
                             33377 non-null object
         4
             address
         5
             zip_code
                           33377 non-null int64
         6
             lat
                             33377 non-null float64
         7
             lng
                             33377 non-null float64
        dtypes: float64(2), int64(2), object(4)
        memory usage: 2.3+ MB
```

Restaurant Menu

Check column: restaurant name

Check column: price: Column will be converted into float type after removing USD.

```
In [37]: r_menu['price_USD'] = r_menu['price_USD'].str.extract(r'(^\d*.\d*)',expand=Fal
se).astype(float)
```

```
In [49]:
          r menu.info()
          r_menu.head(3)
          <class 'pandas.core.frame.DataFrame'>
          Int64Index: 3345541 entries, 0 to 3375210
          Data columns (total 4 columns):
               Column
           #
                                Dtype
          ---
               -----
                                ----
               restaurant_id int64
           0
                                object
           1
               menu
           2
               dish_name
                                object
           3
               price_usd
                                float64
          dtypes: float64(1), int64(1), object(2)
          memory usage: 127.6+ MB
Out[49]:
             restaurant_id
                                                   dish_name price_usd
                                   menu
                       1 Extra Large Pizza Extra Large Meat Lovers
           0
                                                                  15.99
                       1 Extra Large Pizza
                                                                  15.99
           1
                                            Extra Large Supreme
```

Extra Large Pepperoni

14.99

Storing the cleaned files in S3 bucket having cleaned_data folder

1 Extra Large Pizza

To utilise space appropriately, *r* menu and *r* list dataframe was stored in parquet format.

Query the required results

2

The query can be performed using AWS Athena also. But query is performed form this notebook by integrating Athena with the help of AWS Data Wrangler.

1) Query to find restaurants starting with AI

```
sql_query_1 = """
In [82]:
            SELECT restaurant_name,price_range,address
            FROM restaurant_list
            WHERE restaurant_name LIKE 'A1%'
In [83]:
            r_list_query = wr.athena.read_sql_query(sql_query_1,database="project-2-etl-da
            tabase")
In [84]:
            r_list_query
Out[84]:
                                        restaurant_name price_range
                                                                                                      address
                                                                         5704 Birmingport Rd, Sylvan Springs, AL,
               0
                                                                    $
                                             Allstar Diner
                                                                                                        35118
               1
                                      All Original Pizzeria
                                                                   $$
                                                                                         215, Helena, AL, 35080
                                                                         25771 Perdido Beach Boulevard, Orange
               2
                                      Aloha Hawaiian Grill
                                                                   $$
                                                                                                    Beach, A...
               3
                      Albertsons Express (105 Buffalo Way)
                                                                    $
                                                                            105 Buffalo Way, Jackson, WY, 83001
                                                                            5800 Yellowstone Rd, Cheyenne, WY,
                  Albertsons Express (5800 Yellowstone Rd)
                                                                    $
                                                                                                        82009
                   All About Breakfast (5610 North Interstate
                                                                         5610 North Interstate Highway 35, Austin,
                                                                   $$
             145
                                                   Hig...
                                                                        2011 little elm trl #106 cedar park tx78613,
                                                                    $
             146
                                      Aleida's Restaurant
                   All About Breakfast (200 Buttercup Creek
                                                                           200 Buttercup Creek Boulevard, Cedar
                                                                   $$
             147
```

150 rows × 3 columns

148

149

2) Query to find Restaurants starting with R with pizza in the menu having price between 10 & 40 USD

All Star Burger (Bee Cave)

Almarah Mediterranean Cuisine (Ranch

Boule...

Rd)

\$

\$

Park, TX,...

78738

12921 Hill Country Blvd, Bee Cave, TX,

12129 Ranch Rd 620 N, Austin, TX, 78750

In [87]: r_comb_query

Out[87]:

	restaurant_name	restaurant_id	menu	dish_name	price_usd
0	Romio's Pizza & Pasta (Redmond)	9343	Italian specialty pizzas	Zorba Specialty Pizza - 18" - X-Large	33.19
1	Romio's Pizza & Pasta (Redmond)	9343	Italian specialty pizzas	Zorba Specialty Pizza - 15" - Large	27.85
2	Romio's Pizza & Pasta (Redmond)	9343	Italian specialty pizzas	Zorba Specialty Pizza - 12" - Medium	22.49
3	Romio's Pizza & Pasta (Redmond)	9343	Italian specialty pizzas	Zorba Specialty Pizza - 10" - Small	17.15
4	Romio's Pizza & Pasta (Redmond)	9343	Italian specialty pizzas	Zeus Specialty Pizza - 18" - X-Large	33.19
81	Rocco's	15345	Specialty Pizzas. 20" or Half of a 20" pizza	Cousin Margaret (Margherita)	31.00
82	Rocco's	15345	Specialty Pizzas. 20" or Half of a 20" pizza	Chilango	37.00
83	Rocco's	15345	Specialty Pizzas. 20" or Half of a 20" pizza	Chicken Pesto	39.00
84	Rocco's	15345	Specialty Pizzas. 20" or Half of a 20" pizza	BBQ Pizza	39.00
85	Rocco's	15345	Specialty Pizzas. 20" or Half of a 20" pizza	Banh Mi Pizza	39.00

86 rows × 5 columns