labassignment3

February 2, 2023

1 Lab Assignment 3: How to Load, Convert, and Write JSON Files in Python

1.1 DS 6001: Practice and Application of Data Science

1.1.1 Instructions

Please answer the following questions as completely as possible using text, code, and the results of code as needed. Format your answers in a Jupyter notebook. To receive full credit, make sure you address every part of the problem, and make sure your document is formatted in a clean and professional way.

1.2 Problem 0

Import the following libraries:

```
[1]: import numpy as np
import pandas as pd
import requests
import json
import sys
sys.tracebacklimit = 0 # turn off the error tracebacks
```

1.3 Problem 1

JSON and CSV are both text-based formats for the storage of data. It's possible to open either one in a plain text editor. Given this similarity, why does a CSV file usually take less memory than a JSON formatted file for the same data? Under what conditions could a JSON file be smaller in memory than a CSV file for the same data? (2 points)

Consider a CSV file with the following contents:

```
print(csv_data[0:699])
print('characters: ' + str(len(csv_data)))
```

characters: 10780

Such a data set may be represented by the following JSON elements:

```
[3]: json_element = data_frame.to_json(orient = "records")
    print(json_element[0:1091])
    print('characters: ' + str(len(json_element)))

    json_element = data_frame.to_json(orient = "columns")
    print(json_element[0:1091])
    print('characters: ' + str(len(json_element)))

    json_element = data_frame.to_json(orient = "split")
    print(json_element[0:1091])
    print('characters: ' + str(len(json_element)))

    json_element = data_frame.to_json(orient = "index")
    print(json_element[0:1091])
    print('characters: ' + str(len(json_element)))

    json_element = data_frame.to_json(orient = "values")
    print(json_element[0:1091])
    print('characters: ' + str(len(json_element)))
```

[{"c0":0.0,"c1":null,"c2":null,"c3":null,"c4":null,"c5":null,"c6":null,"c7":null,
,"c8":null,"c9":null,"c10":null,"c11":null,"c12":null,"c13":null,"c14":null,"c15
":null,"c16":null,"c17":null,"c18":null,"c19":null,"c20":null,"c21":null,"c22":n
ull,"c23":null,"c24":null,"c25":null,"c26":null,"c27":null,"c28":null,"c29":null
,"c30":null,"c31":null,"c32":null,"c33":null,"c34":null,"c35":null,"c36":null,"c
37":null,"c38":null,"c39":null,"c40":null,"c41":null,"c42":null,"c43":null,"c44"
:null,"c45":null,"c46":null,"c47":null,"c48":null,"c49":null,"c50":null,"c51":nu
ll,"c52":null,"c53":null,"c54":null,"c55":null,"c56":null,"c56":null,"c65":null,"c66":null,"c66":null,"c67":null,"c68":null,"c69":null,"c70":null,"c71":null,"c72":null,"c73":

null,"c74":null,"c75":null,"c76":null,"c77":null,"c78":null,"c79":null,"c80":nul
1,"c81":null,"c82":null,"c83":null,"c84":null,"c85":null,"c86":null,"c87":null,"
c88":null,"c89":null,"c90":null,"c91":null,"c92":null,"c93":null,"c94":null,"c95
":null,"c96":null,"c97":null,"c98":null,"c99":null}

characters: 109191

{"c0":{"0":0.0,"1":null,"2":null,"3":null,"4":null,"5":null,"6":null,"7":null,"8
":null,"9":null,"10":null,"11":null,"12":null,"13":null,"14":null,"15":null,"16"
:null,"17":null,"18":null,"19":null,"20":null,"21":null,"22":null,"23":null,"24"
:null,"25":null,"26":null,"27":null,"28":null,"29":null,"30":null,"31":null,"32"
:null,"33":null,"34":null,"35":null,"36":null,"37":null,"38":null,"39":null,"40"
:null,"41":null,"42":null,"43":null,"44":null,"45":null,"46":null,"47":null,"48"
:null,"49":null,"50":null,"51":null,"52":null,"53":null,"54":null,"55":null,"56":null,"57":null,"58":null,"59":null,"60":null,"61":null,"62":null,"63":null,"64":null,"65":null,"66":null,"67":null,"68":null,"69":null,"70":null,"71":null,"72":null,"73":null,"74":null,"75":null,"76":null,"77":null,"78":null,"88":null,"89":null,"90":null,"91":null,"92":null,"93":null,"94":null,"95":null,"96":null,"96":null,"97":null,"98":null,"99":null,"8":null,"99":null,"9":null,"95":null,"3":null,"4":null,"5":null,"95":null,"96":null,"97":null,"98":null,"99":null,"88":null,"99":null,"99":null,"99":null,"99":null,"98":null,"98":null,"99":null,"99":null,"99":null,"99":null,"98":null,"98":null,"99"

characters: 99781

characters: 51102

{"0":{"c0":0.0,"c1":null,"c2":null,"c3":null,"c4":null,"c5":null,"c6":null,"c7":
null,"c8":null,"c9":null,"c10":null,"c11":null,"c12":null,"c13":null,"c14":null,
"c15":null,"c16":null,"c17":null,"c18":null,"c19":null,"c20":null,"c21":null,"c2
2":null,"c23":null,"c24":null,"c25":null,"c26":null,"c27":null,"c28":null,"c29":
null,"c30":null,"c31":null,"c32":null,"c33":null,"c34":null,"c35":null,"c36":nul
1,"c37":null,"c38":null,"c39":null,"c40":null,"c41":null,"c42":null,"c43":null,"
c44":null,"c45":null,"c46":null,"c47":null,"c48":null,"c50":null,"c50":null,"c51
":null,"c52":null,"c53":null,"c54":null,"c55":null,"c56":null,"c57":null,"c58":n
ull,"c59":null,"c60":null,"c61":null,"c62":null,"c63":null,"c64":null,"c72":null,"c
73":null,"c74":null,"c75":null,"c76":null,"c77":null,"c78":null,"c79":null,"c80":null,"c80":null,"c88":null,"c89":null,"c89":null,"c89":null,"c99":null,"c92":null,"c93":null,"c94":null,"c

```
"c95":null, "c96":null, "c97":null, "c98":null, "c99":n
characters: 109681
null, null,
null, null, null, null, null, null, null, null, null, null, null, null, null, null, null, null, null,
null, null, null, null, null, 1.0, null, null,
1, null, null
1, null, null
1, null, nul
ll, null, null, null, null, null, null, null, null, null, null
characters: 50191
```

A CSV file usually takes less memory than a JSON formatted file for the same data because the number of characters in the CSV file is usually less than the number of characters in each JSON element for the same data.

That being said, consider the following JSON elements:

```
[4]: def convert to JSON string(data frame, orientation):
         if orientation == 'records':
             JSON array = []
             for i in range(0, len(data_frame.index)):
                 JSON_object = {}
                 for column name in data frame.columns:
                     if not pd.isnull(data_frame.at[i, column_name]):
                         JSON_object[column_name] = data_frame.at[i, column_name]
                 if JSON_object:
                     JSON_array.append(JSON_object)
             return str(JSON_array).replace(' ', '')
         if orientation == 'columns':
             JSON_object = {}
             for column_name in data_frame.columns:
                 JSON_subobject = {}
                 for i in range(0, len(data frame.index)):
                     if not pd.isnull(data_frame.at[i, column_name]):
                         JSON_subobject[str(i)] = data_frame.at[i, column_name]
                 if JSON subobject:
                     JSON_object[column_name] = JSON_subobject
             return str(JSON_object).replace(' ', '')
         if orientation == 'split':
             JSON_object = {}
             JSON_object['columns'] = data_frame.columns.to_list()
```

```
JSON_object['index'] = data_frame.index.to_list()
    JSON_array = []
    for i in range(0, len(data_frame.index)):
        JSON_subarray = []
        for column in data_frame.columns:
            if not pd.isnull(data_frame.at[i, column]):
                JSON_subarray.append(data_frame.at[i, column])
            else:
                JSON subarray.append('null')
        JSON_array.append(JSON_subarray)
    JSON_object['data'] = JSON_array
    return str(JSON_object).replace(' ', '')
if orientation == 'index':
    JSON_object = {}
    for i in range(0, len(data_frame.index)):
        JSON_subobject = {}
        for column_name in data_frame.columns:
            if not pd.isnull(data_frame.at[i, column_name]):
                JSON_subobject[column_name] = data_frame.at[i, column_name]
        if JSON_subobject:
            JSON_object[str(i)] = JSON_subobject
    return str(JSON_object).replace(' ', '')
if orientation == 'values':
    JSON array = []
    for i in range(0, len(data_frame.index)):
        JSON_subarray = []
        for column in data_frame.columns:
            if not pd.isnull(data_frame.at[i, column]):
                JSON_subarray.append(data_frame.at[i, column])
            else:
                JSON_subarray.append('null')
        JSON_array.append(JSON_subarray)
    return str(JSON_array).replace(' ', '')
return None
```

```
print(json_element[0:1091])
print('characters: ' + str(len(json_element)))
json_element = convert_to_JSON_string(data_frame = data_frame, orientation = __
  print(json element[0:1091])
print('characters: ' + str(len(json_element)))
json_element = convert_to_JSON_string(data_frame = data_frame, orientation = u
 print(json_element[0:1091])
print('characters: ' + str(len(json_element)))
[{'c0':0.0},{'c1':1.0},{'c2':2.0},{'c3':3.0},{'c4':4.0},{'c5':5.0},{'c6':6.0},{'
c7':7.0},{'c8':8.0},{'c9':9.0},{'c10':10.0},{'c11':11.0},{'c12':12.0},{'c13':13.
0},{'c14':14.0},{'c15':15.0},{'c16':16.0},{'c17':17.0},{'c18':18.0},{'c19':19.0}
,{'c20':20.0},{'c21':21.0},{'c22':22.0},{'c23':23.0},{'c24':24.0},{'c25':25.0},{
'c26':26.0},{'c27':27.0},{'c28':28.0},{'c29':29.0},{'c30':30.0},{'c31':31.0},{'c
32':32.0},{'c33':33.0},{'c34':34.0},{'c35':35.0},{'c36':36.0},{'c37':37.0},{'c38
':38.0},{'c39':39.0},{'c40':40.0},{'c41':41.0},{'c42':42.0},{'c43':43.0},{'c44':
44.0},{'c45':45.0},{'c46':46.0},{'c47':47.0},{'c48':48.0},{'c49':49.0},{'c50':50
.0},{'c51':51.0},{'c52':52.0},{'c53':53.0},{'c54':54.0},{'c55':55.0},{'c56':56.0
},{'c57':57.0},{'c58':58.0},{'c59':59.0},{'c60':60.0},{'c61':61.0},{'c62':62.0},
{'c63':63.0},{'c64':64.0},{'c65':65.0},{'c66':66.0},{'c67':67.0},{'c68':68.0},{'
c69':69.0},{'c70':70.0},{'c71':71.0},{'c72':72.0},{'c73':73.0},{'c74':74.0},{'c7
5':75.0},{'c76':76.0},{'c77':77.0},{'c78':78.0},{'c79':79.0},{'c80':80.0},{'c81'
:81.0},{'c82':82.0},{'c83':83.0},{'c84':84.0},{'c85
characters: 1281
{'c0':{'0':0.0},'c1':{'1':1.0},'c2':{'2':2.0},'c3':{'3':3.0},'c4':{'4':4.0},'c5'
:{'5':5.0},'c6':{'6':6.0},'c7':{'7':7.0},'c8':{'8':8.0},'c9':{'9':9.0},'c10':{'1
0':10.0},'c11':{'11':11.0},'c12':{'12':12.0},'c13':{'13':13.0},'c14':{'14':14.0}
,'c15':{'15':15.0},'c16':{'16':16.0},'c17':{'17':17.0},'c18':{'18':18.0},'c19':{
'19':19.0},'c20':{'20':20.0},'c21':{'21':21.0},'c22':{'22':22.0},'c23':{'23':23.
0},'c24':{'24':24.0},'c25':{'25':25.0},'c26':{'26':26.0},'c27':{'27':27.0},'c28'
:{'28':28.0},'c29':{'29':29.0},'c30':{'30':30.0},'c31':{'31':31.0},'c32':{'32':3
2.0},'c33':{'33':33.0},'c34':{'34':34.0},'c35':{'35':35.0},'c36':{'36':36.0},'c3
7':{'37':37.0},'c38':{'38':38.0},'c39':{'39':39.0},'c40':{'40':40.0},'c41':{'41'
:41.0},'c42':{'42':42.0},'c43':{'43':43.0},'c44':{'44':44.0},'c45':{'45':45.0},'
c46':{'46':46.0},'c47':{'47':47.0},'c48':{'48':48.0},'c49':{'49':49.0},'c50':{'5
0':50.0},'c51':{'51':51.0},'c52':{'52':52.0},'c53':{'53':53.0},'c54':{'54':54.0}
,'c55':{'55':55.0},'c56':{'56':56.0},'c57':{'57':57.0},'c58':{'58':58.0},'c59':{
'59':59.0},'c60':{'60':60.0},'c61':{'61':61.0},'c62
characters: 1771
{'columns':['c0','c1','c2','c3','c4','c5','c6','c7','c8','c9','c10','c11','c12',
```

'c13','c14','c15','c16','c17','c18','c19','c20','c21','c22','c23','c24','c25','c
26','c27','c28','c29','c30','c31','c32','c33','c34','c35','c36','c37','c38','c39
','c40','c41','c42','c43','c44','c45','c46','c47','c48','c49','c50','c51','c52',

'c53','c54','c55','c56','c57','c58','c59','c60','c61','c62','c63','c64','c65','c
66','c67','c68','c69','c70','c71','c72','c73','c74','c75','c76','c77','c78','c79
','c80','c81','c82','c83','c84','c85','c86','c87','c88','c89','c90','c91','c92',
'c93','c94','c95','c96','c97','c98','c99'],'index':[0,1,2,3,4,5,6,7,8,9,10,11,12
,13,14,15,16,17,18,19,20,21,22,23,24,25,26,27,28,29,30,31,32,33,34,35,36,37,38,3
9,40,41,42,43,44,45,46,47,48,49,50,51,52,53,54,55,56,57,58,59,60,61,62,63,64,65,66,67,68,69,70,71,72,73,74,75,76,77,78,79,80,81,82,83,84,85,86,87,88,89,90,91,92
,93,94,95,96,97,98,99],'data':[[0.0,'null','n

characters: 70902

{'o':{'c0':0.0},'1':{'c1':1.0},'2':{'c2':2.0},'3':{'c3':3.0},'4':{'c4':4.0},'5': {'c5':5.0},'6':{'c6':6.0},'7':{'c7':7.0},'8':{'c8':8.0},'9':{'c9':9.0},'10':{'c1} O':10.0},'11':{'c11':11.0},'12':{'c12':12.0},'13':{'c13':13.0},'14':{'c14':14.0},'15':{'c15':15.0},'16':{'c16':16.0},'17':{'c17':17.0},'18':{'c18':18.0},'19':{'c19':19.0},'20':{'c20':20.0},'21':{'c21':21.0},'22':{'c22':22.0},'23':{'c23':23.0},'24':{'c24':24.0},'25':{'c25':25.0},'26':{'c26':26.0},'27':{'c27':27.0},'28':{'c28':28.0},'29':{'c29':29.0},'30':{'c30':30.0},'31':{'c31':31.0},'32':{'c32':32.0},'33':{'c33':33.0},'34':{'c34':34.0},'35':{'c35':35.0},'36':{'c36':36.0},'37':{'c37':37.0},'38':{'c38':38.0},'39':{'c39':39.0},'40':{'c40':40.0},'41':{'c41':41.0},'42':{'c42':42.0},'43':{'c43':43.0},'44':{'c44':44.0},'45':{'c45':45.0},'46':{'c46':46.0},'47':{'c47':47.0},'48':{'c48':48.0},'49':{'c49':49.0},'50':{'c50':50.0},'51':{'c51':51.0},'52':{'c52':52.0},'53':{'c53':53.0},'54':{'c54':54.0},'55':{'c55':55.0},'56':{'c56':56.0},'57':{'c57':57.0},'58':{'c58':58.0},'59':{'c59':59.0},'60':{'c60':60.0},'61':{'c61':61.0},'62'

characters: 1771

[[0.0,'null','nu

characters: 69991

The number of characters in some of our JSON elements is less than the number of characters in our CSV data.

A JSON file can be smaller in memory than a CSV file when there are many data, many missing values, and omission of missing values from the JSON file.

1.4 Problem 2

NASA has a dataset of all meteorites that have fallen to Earth between the years A.D. 860 and 2013. The data contain the name of each meteorite, along with the coordinates of the place where the meteorite hit, the mass of the meteorite, and the date of the collison. The data is stored as a JSON here: https://data.nasa.gov/resource/y77d-th95.json

Look at the data in your web-browser and explain which strategy for loading the JSON into Python makes the most sense and why.

Then write and run the code that will work for loading the data into Python. (2 points)

Looking at the data in Chrome, I observe that there is nesting but no metadata, and that the data set is a JSON array. Thus, I may:

- 1. Use requests.get to download the raw JSON data,
- 2. Use json.loads on the text attribute of the output from step 1 to register the data as a list in Python, and
- 3. Use the pd.json_normalize function on the list that is the output of step 2.

| [6]: | | name | id | nametype | | recclass | mass | fall \ | |
|------|-----|------------|--------|----------|------------|---------------|----------|--------|---|
| | 0 | Aachen | 1 | Valid | | L5 | 21 | Fell | |
| | 1 | Aarhus | 2 | Valid | | Н6 | 720 | Fell | |
| | 2 | Abee | 6 | Valid | | EH4 | 107000 | Fell | |
| | 3 | Acapulco | 10 | Valid | | Acapulcoite | 1914 | Fell | |
| | 4 | Achiras | 370 | Valid | | L6 | 780 | Fell | |
| | | ••• | ••• | ••• | | | ••• | | |
| | 995 | Tirupati | 24009 | Valid | | Н6 | 230 | Fell | |
| | 996 | Tissint | 54823 | Valid | Martian | (shergottite) | 7000 | Fell | |
| | 997 | Tjabe | 24011 | Valid | | Н6 | 20000 | Fell | |
| | 998 | Tjerebon | 24012 | Valid | | L5 | 16500 | Fell | |
| | 999 | Tomakovka | 24019 | Valid | | LL6 | 600 | Fell | |
| | | | | | 7-4 | | | · | , |
| | | | | year | reclat | O | geolocat | 0.2 | \ |
| | 0 | 1880-01-01 | T00:00 | :00.000 | 50.775000 | 6.083330 | | Point | |
| | 1 | 1951-01-01 | T00:00 | :00.000 | 56.183330 | 10.233330 | | Point | |
| | 2 | 1952-01-01 | T00:00 | :00.000 | 54.216670 | -113.000000 | | Point | |
| | 3 | 1976-01-01 | T00:00 | :00.000 | 16.883330 | -99.900000 | | Point | |
| | 4 | 1902-01-01 | T00:00 | :00.000 | -33.166670 | -64.950000 | | Point | |
| | | | | ••• | | ••• | ••• | • | |
| | 995 | 1934-01-01 | T00:00 | :00.000 | 13.633330 | 79.416670 | | Point | |

```
996
    2011-01-01T00:00:00.000
                                 29.481950
                                               -7.611230
                                                                      Point
997
     1869-01-01T00:00:00.000
                                 -7.083330
                                                                      Point
                                              111.533330
998
     1922-01-01T00:00:00.000
                                 -6.666670
                                              106.583330
                                                                      Point
999
     1905-01-01T00:00:00.000
                                 47.850000
                                               34.766670
                                                                      Point
    geolocation.coordinates :@computed_region_cbhk_fwbd
0
           [6.08333, 50.775]
                                                        NaN
1
       [10.23333, 56.18333]
                                                        NaN
2
            [-113, 54.21667]
                                                        NaN
3
           [-99.9, 16.88333]
                                                        NaN
        [-64.95, -33.16667]
4
                                                        NaN
995
       [79.41667, 13.63333]
                                                        NaN
996
       [-7.61123, 29.48195]
                                                        NaN
      [111.53333, -7.08333]
997
                                                        NaN
      [106.58333, -6.66667]
998
                                                        NaN
999
          [34.76667, 47.85]
                                                        NaN
    :@computed_region_nnqa_25f4
0
                              NaN
1
                              NaN
2
                              NaN
3
                              NaN
4
                              NaN
. .
995
                              NaN
996
                              NaN
997
                              NaN
998
                              NaN
999
                              NaN
```

[1000 rows x 13 columns]

1.5 Problem 3

The textbook chapter for this module shows, as an example, how to pull data in JSON format from Reddit's top 25 posts on /r/popular. The steps outlined there pull all of the features in the data into the dataframe, resulting in a dataframe with 172 columns.

If we only wanted a few features, then looping across elements of the JSON list itself and extracting only the data we want may be a more efficient approach.

Use looping - and not pd.read_json() or pd.json_normalize() - to create a dataframe with 25 rows (one for each of the top 25 posts), and only columns for subreddit, title, ups, and created_utc. The JSON file exists at http://www.reddit.com/r/popular/top.json, and don't forget to specify headers = {'User-agent': 'DS6001'} within requests.get(). (3 points)

```
[8]: url = 'http://www.reddit.com/r/popular/top.json'
                   the_headers = {'User-agent': 'DS6001'}
                   response = requests.get(url, headers = the_headers)
                   response_body_as_string = response.text
                   body = json.loads(response_body_as_string)
                   data = body.get('data')
                   children = data.get('children')
                   data_frame = pd.DataFrame({'subreddit': [], 'title': [], 'ups': [], ups': []

¬'created_utc': []})
                   for i in range(0, len(children)):
                                   child = children[i]
                                   data = child.get('data')
                                   list_of_subreddit_title_ups_and_created_utc = [data.get('subreddit'), data.

→get('title'), data.get('ups'), data.get('created_utc')]
                                   data frame.loc[len(data frame.index)] = ____
                         →list_of_subreddit_title_ups_and_created_utc
                   data_frame
```

```
[8]:
                  subreddit
                                                                            title \
     0
           nextfuckinglevel
                              The man climbed out of his eighth floor apartm...
                MadeMeSmile
                              Last January I started my sobriety and health ...
     1
     2
                      meirl
                                                                            meirl
     3
                      gaming
                                                                 Sonic's Hedgehog
     4
         WhitePeopleTwitter
                                     I guess I'm getting rid of Netflix then...
     5
                      meirl
                                                                            meirl
                                                           like father like son!
     6
             wholesomememes
     7
                                                   Sleeping in the mother's arms
                         aww
     8
          interestingasfuck
                              In the 1970s, North Korea ordered 1,000 Volvo ...
     9
                  dankmemes
                                                         Is a.i. art banned yet?
     10
                              TIL: In 1962, a 10 year old found a radioactiv...
              todavilearned
     11
          interestingasfuck
                              The last delivered Boeing 747 made a crown wit...
     12
                rareinsults
                                                                  Mayo is no joke
     13
           AnimalsBeingBros
                              Parrot ask his owner if he's alright after he ...
     14
                                                   To massage yourself unnoticed
          therewasanattempt
     15
                 Unexpected
                                                          The Night Train nsfw
     16
                              California police kill double amputee who was ...
                       news
     17
                                                               [OC] Single Player
                      comics
     18
          mildlyinfuriating
                              Convenience store worker wouldn't accept this ...
     19
                              Fireworks in House after Democrat says 'insurr...
                   politics
     20
             PublicFreakout
                              12 Year Old Tiktok prankster throws a dead sna...
     21
         WhitePeopleTwitter
     22
            HumansBeingBros
                              Saving a cow calf from crossing the rainbow road.
     23
                   antiwork
                                               First the French now the Brits
     24
             wallstreetbets
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     74146
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             1.675234e+09
     64840
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     63646
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     62637
             1.675255e+09
     62167
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10
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             1.675245e+09
11
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             1.675280e+09
12
             1.675262e+09
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             1.675270e+09
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     51793
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     48763
             1.675258e+09
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     44390
             1.675267e+09
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     45017
             1.675284e+09
20
     44506
             1.675272e+09
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     43642
             1.675273e+09
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     43463
             1.675270e+09
23
     41923
             1.675255e+09
24
     41043
            1.675269e+09
```

1.6 Problem 4

The NBA has saved data on all 30 teams' shooting statistics for the 2014-2015 season here: https://stats.nba.com/js/data/sportvu/2015/shootingTeamData.json. Take a moment and look at this JSON file in your web browser. The structure of this particular JSON is complicated, but see if you can find the team-by-team data. In this problem our goal is to use pd.json_normalize() to get the data into a dataframe. The following questions will guide you towards this goal.

1.6.1 Part a

Download the raw text of the NBA JSON file and register it as JSON formatted data in Python's memory. (2 points)

```
[9]: url = 'https://stats.nba.com/js/data/sportvu/2015/shootingTeamData.json'
    response = requests.get(url)
    response_body_as_string = response.text
    body = json.loads(response_body_as_string)
```

1.6.2 Part b

Describe, in words, the path that leads to the team-by-team data. (2 points)

The response body of the request to https://stats.nba.com/js/data/sportvu/2015/shootingTeamData.json is a JSON object. This JSON object has a field with key resultSets and a value of a JSON

array. This JSON array has one JSON object. This JSON object has a field with key rowSet and a value of a JSON array of team-by-team data.

1.6.3 Part c

Use the pd.json_normalize() function to pull the team-by-team data into a dataframe. This is going to be tricky. You will need to use indexing on the JSON data as well as the record_path parameter.

If you are successful, you will have a dataframe with 30 rows and 33 columns. The first row will refer to the Golden State Warriors, the second row will refer to the San Antonio Spurs, and the third row will refer to the Cleveland Cavaliers. The columns will only be named 0, 1, 2, ... at this point. (4 points)

```
[10]: data_frame = pd.json_normalize(body, record_path = ['resultSets', 'rowSet'])
data_frame
```

| [10]: | 0 | 1 | 2 | 3 4 | 5 | 6 | 7 | 8 | \ |
|-------|------------|-----------------|---------------|-----|----|------|-------|------|---|
| 0 | 1610612744 | Golden State | Warriors | GSW | 82 | 48.7 | 114.9 | 14.9 | |
| 1 | 1610612759 | San Antonio | Spurs | SAS | 82 | 48.3 | 103.5 | 14.8 | |
| 2 | 1610612739 | Cleveland | Cavaliers | CLE | 82 | 48.7 | 104.3 | 16.9 | |
| 3 | 1610612746 | Los Angeles | Clippers | LAC | 82 | 48.6 | 104.5 | 15.0 | |
| 4 | 1610612760 | Oklahoma City | Thunder | OKC | 82 | 48.6 | 110.2 | 16.1 | |
| 5 | 1610612737 | Atlanta | Hawks | ATL | 82 | 48.6 | 102.8 | 19.0 | |
| 6 | 1610612745 | Houston | Rockets | HOU | 82 | 48.6 | 106.5 | 17.2 | |
| 7 | 1610612757 | Portland | Trail Blazers | POR | 82 | 48.5 | 105.1 | 17.5 | |
| 8 | 1610612758 | Sacramento | Kings | SAC | 81 | 48.4 | 106.7 | 18.7 | |
| 9 | 1610612764 | Washington | Wizards | WAS | 82 | 48.5 | 104.1 | 15.4 | |
| 10 | 1610612748 | Miami | Heat | MIA | 82 | 48.6 | 100.0 | 17.9 | |
| 11 | 1610612761 | Toronto | Raptors | TOR | 81 | 48.5 | 102.7 | 23.0 | |
| 12 | 1610612742 | Dallas | Mavericks | DAL | 82 | 49.0 | 102.3 | 18.2 | |
| 13 | 1610612766 | Charlotte | Hornets | CHA | 82 | 48.6 | 103.4 | 16.8 | |
| 14 | 1610612762 | Utah | Jazz | UTA | 82 | 49.0 | 97.7 | 18.1 | |
| 15 | 1610612753 | Orlando | Magic | ORL | 81 | 48.7 | 102.0 | 18.0 | |
| 16 | 1610612749 | Milwaukee | Bucks | MIL | 82 | 48.7 | 99.0 | 17.4 | |
| 17 | 1610612740 | New Orleans | Pelicans | NOP | 82 | 48.5 | 102.7 | 19.9 | |
| 18 | 1610612750 | Minnesota | Timberwolves | MIN | 82 | 48.6 | 102.4 | 15.1 | |
| 19 | 1610612754 | Indiana | Pacers | IND | 82 | 48.8 | 102.2 | 13.7 | |
| 20 | 1610612751 | Brooklyn | Nets | BKN | 82 | 48.4 | 98.6 | 14.4 | |
| 21 | 1610612765 | Detroit | Pistons | DET | 82 | 48.7 | 102.0 | 17.5 | |
| 22 | 1610612743 | Denver | Nuggets | DEN | 82 | 48.6 | 101.9 | 15.9 | |
| 23 | 1610612738 | Boston | Celtics | BOS | 81 | 48.5 | 105.6 | 18.9 | |
| 24 | 1610612741 | ${\tt Chicago}$ | Bulls | CHI | 82 | 48.9 | 101.6 | 18.1 | |
| 25 | 1610612755 | Philadelphia | 76ers | PHI | 82 | 48.6 | 97.4 | 19.7 | |
| 26 | 1610612756 | Phoenix | Suns | PHX | 82 | 48.4 | 100.9 | 15.6 | |
| 27 | 1610612752 | New York | Knicks | NYK | 82 | 48.5 | 98.4 | 10.4 | |
| 28 | 1610612763 | Memphis | Grizzlies | MEM | 82 | 48.6 | 99.1 | 16.4 | |
| 29 | 1610612747 | Los Angeles | Lakers | LAL | 82 | 48.3 | 97.3 | 15.6 | |

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```

[30 rows x 33 columns]

1.6.4 Part d

Find the path that leads to the headers (the column names), and extract these names as a list. Then set the .columns attribute of the dataframe you created in part c equal to this list. The result should be that the dataframe now has the correct column names. (3 points)

```
[11]: list_of_result_sets = body.get('resultSets')
    result_set = list_of_result_sets[0]
    list_of_headers = result_set.get('headers')
    data_frame.columns = list_of_headers
    data_frame
```

| [11]: | | TE | AM_ID | TEAM_CI | TY | TEA | M_N | AME ' | TEAM_ | ABBRI | EVIATI | ON | TEAM_ | CODE | GP | \ |
|-------|----|------------|-------|---------------|---------|-----------|------|-------|-------|-------|--------|----|-------|-------|----|---|
| | 0 | 16106 | 12744 | Golden Sta | te | Wa | rri | ors | | | G | SW | | | 82 | |
| | 1 | 1610612759 | | San Anton | io | | Sp | urs | SAS | | | AS | | | 82 | |
| | 2 | 1610612739 | | Clevela | ind | Cavaliers | | ers | | | C | LE | | | 82 | |
| | 3 | 16106 | 12746 | Los Angel | .es | Cl | ipp | ers | | | L | AC | | | 82 | |
| | 4 | 16106 | 12760 | Oklahoma City | | T | 'hun | der | | | 0 | KC | | | 82 | |
| | 5 | 16106 | 12737 | Atlan | ıta | | Ha | wks | | | A | TL | | | 82 | |
| | 6 | 16106 | 12745 | Houst | on | R | lock | ets | | | Н | OU | | | 82 | |
| | 7 | 16106 | 12757 | Portla | nd | Trail B | Blaz | ers | | | P | OR | | | 82 | |
| | 8 | 16106 | 12758 | Sacramen | ito | | Ki: | ngs | | | S | AC | | | 81 | |
| | 9 | 16106 | 12764 | Washingt | on | W | liza | rds | | | W | AS | | | 82 | |
| | 10 | 16106 | 12748 | Mia | mi | | Н | eat | | | M | IΑ | | | 82 | |
| | 11 | 16106 | 12761 | Toron | ito | | apt | | | | Т | OR | | | 81 | |
| | 12 | 16106 | 12742 | Dall | .as | Mav | eri | cks | | | | AL | | | 82 | |
| | 13 | 16106 | 12766 | Charlot | | H | lorn | ets | | | | HA | | | 82 | |
| | 14 | 16106 | 12762 | Ut | ah | | J | azz | | | | TA | 82 | | | |
| | 15 | 16106 | | Orlan | ıdo | | | gic | | | | RL | 81 | | | |
| | 16 | 16106 | | Milwauk | | | | cks | | | | IL | | | 82 | |
| | 17 | 16106 | | New Orlea | | | lic | | | | | OΡ | 82 | | 82 | |
| | 18 | 16106 | | Minneso | | Timber | wol | ves | | | | IN | | | 82 | |
| | 19 | 16106 | | India | | | Pac | | | | | ND | | | 82 | |
| | 20 | | | Brookl | • | Nets | | | BKN | | | | | | | |
| | 21 | | | Detro | | Pistons | | | DET | | | | | | 82 | |
| | 22 | | | Denv | | | lugg | | DEN | | | | | | 82 | |
| | 23 | 1610612738 | | Bost | Celtics | | | BOS | | | | | | 81 | | |
| | 24 | 16106 | | Chica | _ | | | lls | | | | HΙ | | | 82 | |
| | 25 | 16106 | | Philadelph | | | | ers | | | | ΗI | | | 82 | |
| | 26 | 16106 | | Phoen | | | | uns | | | | HX | | | 82 | |
| | 27 | 16106 | | New York | | Knicks | | | NYK | | | | | | 82 | |
| | 28 | 16106 | | Memph | | Grizzlies | | | MEM | | | | | | 82 | |
| | 29 | 16106 | 12/4/ | Los Angeles | | Lakers | | | LAL | | | AL | | | 82 | |
| | | MIN | PTS | PTS_DRIVE | FGF | DRIVE | ••• | CF | GP U | FGM | UFGA | U | FGP | CFG3M | \ | |
| | 0 | 48.7 | 114.9 | 14.9 | | 0.498 | ••• | 0.4 | 78 2 | 1.2 | 42.5 | 0. | 497 | 2.3 | | |
| | 1 | 48.3 | 103.5 | 14.8 | | 0.481 | ••• | 0.5 | 06 1 | 8.3 | 39.8 | 0. | 460 | 0.9 | | |
| | 2 | 48.7 | 104.3 | 16.9 | | 0.481 | ••• | 0.4 | 73 1 | 8.2 | 40.7 | 0. | 447 | 1.7 | | |
| | 3 | 48.6 | 104.5 | 15.0 | | 0.497 | ••• | 0.48 | 80 1 | 8.9 | 42.0 | 0. | 450 | 2.0 | | |
| | 4 | 48.6 | 110.2 | 16.1 | | 0.480 | ••• | 0.49 | 97 1 | 7.5 | 38.7 | 0. | 451 | 1.6 | | |
| | 5 | 48.6 | 102.8 | 19.0 | | 0.463 | ••• | 0.48 | 83 1 | 9.4 | 44.6 | 0. | 435 | 1.0 | | |
| | 6 | 48.6 | 106.5 | 17.2 | | 0.433 | ••• | 0.4 | 72 1 | 5.5 | 36.4 | 0. | 426 | 2.3 | | |
| | 7 | 48.5 | 105.1 | 17.5 | | 0.441 | ••• | 0.4 | 47 1 | 8.0 | 39.8 | 0. | 453 | 1.7 | | |
| | 8 | 48.4 | 106.7 | 18.7 | | 0.452 | | 0.4 | 73 1 | 8.1 | 39.7 | 0. | 454 | 0.9 | | |
| | 9 | 48.5 | 104.1 | 15.4 | | 0.480 | ••• | 0.48 | 83 1 | 9.5 | 44.3 | 0. | 439 | 0.7 | | |
| | 10 | 48.6 | 100.0 | 17.9 | | 0.488 | ••• | 0.49 | 90 1 | 5.7 | 35.2 | 0. | 445 | 0.8 | | |
| | 11 | 48.5 | 102.7 | 23.0 | | 0.462 | | 0.4 | | 4.1 | 32.4 | | 436 | 1.8 | | |
| | 12 | 49.0 | 102.3 | 18.2 | | 0.473 | | 0.4 | | 7.5 | 41.4 | | 423 | 1.4 | | |
| | 13 | 48.6 | 103.4 | 16.8 | | 0.459 | ••• | 0.4 | 49 1 | 7.0 | 39.8 | 0. | 427 | 1.8 | | |

| 14 | 49.0 | 97.7 | 18.1 | 0.445 | ••• | 0.468 | 15.9 | 37.2 | 0.426 | 1.4 |
|----|------|-------|------|-------|-----|-------|------|------|-------|-----|
| 15 | 48.7 | 102.0 | 18.0 | 0.456 | ••• | 0.475 | 18.5 | 42.6 | 0.435 | 0.7 |
| 16 | 48.7 | 99.0 | 17.4 | 0.463 | | 0.477 | 13.2 | 29.4 | 0.448 | 1.1 |
| 17 | 48.5 | 102.7 | 19.9 | 0.458 | | 0.460 | 17.9 | 41.1 | 0.434 | 0.6 |
| 18 | 48.6 | 102.4 | 15.1 | 0.464 | | 0.471 | 16.1 | 35.4 | 0.455 | 0.7 |
| 19 | 48.8 | 102.2 | 13.7 | 0.453 | | 0.465 | 16.4 | 38.1 | 0.431 | 1.7 |
| 20 | 48.4 | 98.6 | 14.4 | 0.457 | | 0.464 | 15.8 | 36.1 | 0.438 | 1.0 |
| 21 | 48.7 | 102.0 | 17.5 | 0.464 | | 0.452 | 15.7 | 37.2 | 0.422 | 0.9 |
| 22 | 48.6 | 101.9 | 15.9 | 0.406 | | 0.448 | 16.4 | 37.8 | 0.434 | 1.1 |
| 23 | 48.5 | 105.6 | 18.9 | 0.453 | | 0.451 | 16.9 | 39.9 | 0.424 | 1.6 |
| 24 | 48.9 | 101.6 | 18.1 | 0.458 | | 0.442 | 17.0 | 38.5 | 0.441 | 1.3 |
| 25 | 48.6 | 97.4 | 19.7 | 0.445 | | 0.449 | 15.3 | 37.4 | 0.409 | 1.6 |
| 26 | 48.4 | 100.9 | 15.6 | 0.440 | | 0.447 | 16.6 | 39.5 | 0.421 | 1.4 |
| 27 | 48.5 | 98.4 | 10.4 | 0.447 | | 0.439 | 15.9 | 36.4 | 0.438 | 1.5 |
| 28 | 48.6 | 99.1 | 16.4 | 0.440 | | 0.459 | 16.1 | 38.5 | 0.418 | 0.7 |
| 29 | 48.3 | 97.3 | 15.6 | 0.441 | | 0.420 | 14.0 | 34.5 | 0.406 | 2.2 |
| | | | | | | | | | | |

| | CFG3A | CFG3P | UFG3M | UFG3A | UFG3P |
|----|-------|-------|-------|-------|-------|
| 0 | 6.3 | 0.363 | 10.8 | 25.3 | 0.429 |
| 1 | 2.6 | 0.341 | 6.1 | 15.9 | 0.381 |
| 2 | 5.7 | 0.299 | 9.0 | 23.9 | 0.378 |
| 3 | 6.0 | 0.334 | 7.7 | 20.8 | 0.373 |
| 4 | 5.1 | 0.321 | 6.6 | 18.6 | 0.356 |
| 5 | 3.1 | 0.311 | 9.0 | 25.3 | 0.355 |
| 6 | 7.4 | 0.318 | 8.4 | 23.5 | 0.355 |
| 7 | 5.9 | 0.295 | 8.8 | 22.6 | 0.389 |
| 8 | 3.1 | 0.276 | 7.2 | 19.4 | 0.372 |
| 9 | 2.7 | 0.254 | 8.0 | 21.5 | 0.371 |
| 10 | 2.9 | 0.282 | 5.3 | 15.1 | 0.347 |
| 11 | 5.6 | 0.327 | 6.8 | 17.7 | 0.384 |
| 12 | 5.3 | 0.273 | 8.4 | 23.3 | 0.360 |
| 13 | 6.0 | 0.297 | 8.9 | 23.4 | 0.379 |
| 14 | 4.3 | 0.318 | 7.1 | 19.5 | 0.363 |
| 15 | 2.7 | 0.249 | 7.1 | 19.5 | 0.363 |
| 16 | 4.0 | 0.270 | 4.3 | 11.6 | 0.370 |
| 17 | 2.6 | 0.247 | 7.9 | 21.2 | 0.374 |
| 18 | 2.6 | 0.272 | 4.8 | 13.8 | 0.350 |
| 19 | 5.7 | 0.299 | 6.4 | 17.4 | 0.368 |
| 20 | 3.3 | 0.303 | 5.5 | 15.1 | 0.363 |
| 21 | 4.0 | 0.227 | 8.1 | 22.2 | 0.366 |
| 22 | 4.3 | 0.264 | 6.9 | 19.5 | 0.354 |
| 23 | 5.7 | 0.274 | 7.1 | 20.3 | 0.350 |
| 24 | 3.9 | 0.332 | 6.6 | 17.5 | 0.380 |
| 25 | 5.7 | 0.281 | 7.7 | 21.8 | 0.354 |
| 26 | 5.0 | 0.288 | 7.6 | 20.8 | 0.363 |
| 27 | 4.9 | 0.305 | 5.9 | 16.6 | 0.358 |
| 28 | 2.5 | 0.278 | 5.4 | 16.0 | 0.340 |

[30 rows x 33 columns]

1.7 Problem 5

Save the NBA dataframe you extracted in problem 4 as a JSON-formatted text file on your local machine. Format the JSON so that it is organized as dictionary with three lists: columns lists the column names, index lists the row names, and data is a list-of-lists of data points, one list for each row. (Hint: this is possible with one line of code) (2 points)

```
[12]: data_frame.to_json('shooting_statistics.json', orient = 'split')
pd.read_json('shooting_statistics.json', orient = 'split')
```

| [12]: | | TEAM_ID | TEAM_CITY | TEAM_NAME | TEAM_ABBREVIATION T | EAM_CODE GP \ |
|-------|----|------------|---------------|---------------|---------------------|---------------|
| | 0 | 1610612744 | Golden State | Warriors | GSW | 82 |
| | 1 | 1610612759 | San Antonio | Spurs | SAS | 82 |
| | 2 | 1610612739 | Cleveland | Cavaliers | CLE | 82 |
| | 3 | 1610612746 | Los Angeles | Clippers | LAC | 82 |
| | 4 | 1610612760 | Oklahoma City | Thunder | OKC | 82 |
| | 5 | 1610612737 | Atlanta | Hawks | ATL | 82 |
| | 6 | 1610612745 | Houston | Rockets | HOU | 82 |
| | 7 | 1610612757 | Portland | Trail Blazers | POR | 82 |
| | 8 | 1610612758 | Sacramento | Kings | SAC | 81 |
| | 9 | 1610612764 | Washington | Wizards | WAS | 82 |
| | 10 | 1610612748 | Miami | Heat | MIA | 82 |
| | 11 | 1610612761 | Toronto | Raptors | TOR | 81 |
| | 12 | 1610612742 | Dallas | Mavericks | DAL | 82 |
| | 13 | 1610612766 | Charlotte | Hornets | CHA | 82 |
| | 14 | 1610612762 | Utah | Jazz | UTA | 82 |
| | 15 | 1610612753 | Orlando | Magic | ORL | 81 |
| | 16 | 1610612749 | Milwaukee | Bucks | MIL | 82 |
| | 17 | 1610612740 | New Orleans | Pelicans | NOP | 82 |
| | 18 | 1610612750 | Minnesota | Timberwolves | MIN | 82 |
| | 19 | 1610612754 | Indiana | Pacers | IND | 82 |
| | 20 | 1610612751 | Brooklyn | Nets | BKN | 82 |
| | 21 | 1610612765 | Detroit | Pistons | DET | 82 |
| | 22 | 1610612743 | Denver | Nuggets | DEN | 82 |
| | 23 | 1610612738 | Boston | Celtics | BOS | 81 |
| | 24 | 1610612741 | Chicago | Bulls | CHI | 82 |
| | 25 | 1610612755 | Philadelphia | 76ers | PHI | 82 |
| | 26 | 1610612756 | Phoenix | Suns | PHX | 82 |
| | 27 | 1610612752 | New York | Knicks | NYK | 82 |
| | 28 | 1610612763 | Memphis | Grizzlies | MEM | 82 |
| | 29 | 1610612747 | Los Angeles | Lakers | LAL | 82 |

MIN PTS PTS_DRIVE FGP_DRIVE ... CFGP UFGM UFGA UFGP CFG3M \

| 0 | 48.7 | 114.9 | 14 | . 9 | 0.498 | | 0.478 | 21.2 | 42.5 | 0.497 | 2.3 |
|----|-------|-------|-------|-------|-------|-----|-------|------|------|-------|------------|
| 1 | 48.3 | 103.5 | 14 | | 0.481 | | | 18.3 | 39.8 | 0.460 | 0.9 |
| 2 | 48.7 | 104.3 | 16 | | 0.481 | | | 18.2 | 40.7 | 0.447 | 1.7 |
| 3 | 48.6 | 104.5 | 15 | | 0.497 | | | 18.9 | 42.0 | 0.450 | 2.0 |
| 4 | 48.6 | 110.2 | 16 | | 0.480 | | | 17.5 | 38.7 | 0.451 | 1.6 |
| 5 | 48.6 | 102.8 | 19 | | 0.463 | | | 19.4 | 44.6 | 0.435 | 1.0 |
| 6 | 48.6 | 102.5 | | | | | | 15.5 | 36.4 | 0.435 | |
| | | | 17 | | 0.433 | ••• | | | | | 2.3 1.7 |
| 7 | 48.5 | 105.1 | 17 | | 0.441 | | | 18.0 | 39.8 | 0.453 | |
| 8 | 48.4 | 106.7 | 18 | | 0.452 | | | 18.1 | 39.7 | | 0.9 |
| 9 | 48.5 | 104.1 | 15 | | 0.480 | | | 19.5 | 44.3 | 0.439 | 0.7 |
| 10 | 48.6 | 100.0 | 17 | | 0.488 | | | 15.7 | 35.2 | 0.445 | 0.8 |
| 11 | 48.5 | 102.7 | 23 | | 0.462 | | | 14.1 | 32.4 | 0.436 | 1.8 |
| 12 | 49.0 | 102.3 | 18 | | 0.473 | ••• | | 17.5 | 41.4 | 0.423 | 1.4 |
| 13 | 48.6 | 103.4 | 16 | | 0.459 | ••• | 0.449 | 17.0 | 39.8 | 0.427 | 1.8 |
| 14 | 49.0 | 97.7 | 18 | .1 | 0.445 | ••• | 0.468 | 15.9 | 37.2 | 0.426 | 1.4 |
| 15 | 48.7 | 102.0 | 18 | .0 | 0.456 | ••• | 0.475 | 18.5 | 42.6 | 0.435 | 0.7 |
| 16 | 48.7 | 99.0 | 17 | .4 | 0.463 | ••• | 0.477 | 13.2 | 29.4 | 0.448 | 1.1 |
| 17 | 48.5 | 102.7 | 19 | .9 | 0.458 | ••• | 0.460 | 17.9 | 41.1 | 0.434 | 0.6 |
| 18 | 48.6 | 102.4 | 15 | .1 | 0.464 | ••• | 0.471 | 16.1 | 35.4 | 0.455 | 0.7 |
| 19 | 48.8 | 102.2 | 13 | .7 | 0.453 | ••• | 0.465 | 16.4 | 38.1 | 0.431 | 1.7 |
| 20 | 48.4 | 98.6 | 14 | .4 | 0.457 | ••• | 0.464 | 15.8 | 36.1 | 0.438 | 1.0 |
| 21 | 48.7 | 102.0 | 17 | .5 | 0.464 | ••• | 0.452 | 15.7 | 37.2 | 0.422 | 0.9 |
| 22 | 48.6 | 101.9 | 15 | .9 | 0.406 | ••• | 0.448 | 16.4 | 37.8 | 0.434 | 1.1 |
| 23 | 48.5 | 105.6 | 18 | .9 | 0.453 | ••• | 0.451 | 16.9 | 39.9 | 0.424 | 1.6 |
| 24 | 48.9 | 101.6 | 18 | . 1 | 0.458 | | 0.442 | 17.0 | 38.5 | 0.441 | 1.3 |
| 25 | 48.6 | 97.4 | 19 | .7 | 0.445 | ••• | 0.449 | 15.3 | 37.4 | 0.409 | 1.6 |
| 26 | 48.4 | 100.9 | 15 | .6 | 0.440 | ••• | 0.447 | 16.6 | 39.5 | 0.421 | 1.4 |
| 27 | 48.5 | 98.4 | 10 | .4 | 0.447 | ••• | 0.439 | 15.9 | 36.4 | 0.438 | 1.5 |
| 28 | 48.6 | 99.1 | 16 | | 0.440 | | 0.459 | 16.1 | 38.5 | 0.418 | 0.7 |
| 29 | 48.3 | 97.3 | 15 | | 0.441 | | | 14.0 | 34.5 | 0.406 | 2.2 |
| | | | | | | | | | | | |
| | CFG3A | CFG3P | UFG3M | UFG3A | UFG3P | | | | | | |
| 0 | 6.3 | 0.363 | 10.8 | 25.3 | 0.429 | | | | | | |
| 1 | 2.6 | 0.341 | 6.1 | 15.9 | 0.381 | | | | | | |
| 2 | 5.7 | | 9.0 | 23.9 | 0.378 | | | | | | |
| 3 | 6.0 | 0.334 | 7.7 | 20.8 | 0.373 | | | | | | |
| 4 | 5.1 | 0.321 | 6.6 | 18.6 | 0.356 | | | | | | |
| 5 | 3.1 | 0.311 | 9.0 | 25.3 | 0.355 | | | | | | |
| 6 | 7.4 | 0.311 | 8.4 | 23.5 | 0.355 | | | | | | |
| 7 | 5.9 | 0.316 | 8.8 | 22.6 | 0.389 | | | | | | |
| 8 | | | | | | | | | | | |
| | 3.1 | 0.276 | 7.2 | 19.4 | 0.372 | | | | | | |
| 9 | 2.7 | 0.254 | 8.0 | 21.5 | 0.371 | | | | | | |
| 10 | 2.9 | 0.282 | 5.3 | 15.1 | 0.347 | | | | | | |
| 11 | 5.6 | 0.327 | 6.8 | 17.7 | | | | | | | |
| 12 | 5.3 | 0.273 | 8.4 | 23.3 | 0.360 | | | | | | |
| 13 | 6.0 | 0.297 | 8.9 | 23.4 | 0.379 | | | | | | |
| 14 | 4.3 | 0.318 | 7.1 | 19.5 | 0.363 | | | | | | |

```
2.7 0.249
15
                   7.1
                         19.5 0.363
16
     4.0 0.270
                   4.3
                         11.6 0.370
     2.6 0.247
17
                   7.9
                         21.2 0.374
18
     2.6 0.272
                   4.8
                         13.8 0.350
19
     5.7 0.299
                   6.4
                         17.4 0.368
20
     3.3 0.303
                   5.5
                         15.1 0.363
21
     4.0 0.227
                   8.1
                         22.2 0.366
22
     4.3 0.264
                   6.9
                         19.5 0.354
23
     5.7 0.274
                   7.1
                         20.3 0.350
24
     3.9 0.332
                   6.6
                         17.5 0.380
     5.7 0.281
                   7.7
25
                         21.8 0.354
26
     5.0 0.288
                   7.6
                         20.8 0.363
27
     4.9 0.305
                   5.9
                         16.6 0.358
28
     2.5 0.278
                   5.4
                         16.0 0.340
29
     7.9 0.278
                   5.6
                         16.7 0.335
```

[30 rows x 33 columns]

[]: