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DSC 650 - Assignment07



Apache Parquet Gzip Reference: https://docs.python.org/3/library/gzip.html)

(https://docs.python.org/3/library/gzip.html)

Apache Parquet Load from JSONL files https://arrow.apache.org/docs/python/json.html https://arrow.apache.org/docs/python/json.html)

Apache Parquet, Read/Write parquet tables https://arrow.apache.org/docs/python/parquet.html https://arrow.apache.org/docs/python/parquet.html)

Python Check if File Exists: https://www.pythontutorial.net/python-basics/python-check-if-file-exists/) exists/ (https://www.pythontutorial.net/python-basics/python-check-if-file-exists/)

```
9 import hashlib
10 #//*** Use the whole window in the IPYNB editor
11 from IPython.display import display, HTML
12 display(HTML("<style>.container { width:100% !important; }</style>"))
13
14 #//*** Maximize columns and rows displayed by pandas
15 pd.set option('display.max rows', 100)
16 pd.set option('display.max columns', None)
17
18 import pyarrow as pa
19 #from pyarrow.json import read json
20 import pyarrow.parquet as pq
21
22
23
24 #//*** Build results and results/kv folders
25 current dir = Path(os.getcwd()).absolute()
26 results dir = current dir.joinpath('results')
27 kv dir = results dir.joinpath('kv')
28 hash dir = results dir.joinpath('hash')
29 geo dir = results dir.joinpath('geo')
30
31 results dir.mkdir(parents=True, exist ok=True)
32 kv dir.mkdir(parents=True, exist ok=True)
33 hash dir.mkdir(parents=True, exist ok=True)
34 geo dir.mkdir(parents=True, exist ok=True)
35
```

7a

Load Parquet File. Build a Key column Formatted as [dst_Airport]['iata'][src_Airport]['iata'][airline] ['icao'].

Create kv_key column, that assigns a value from Partitions. This indexes by 16 values in the partitions table.

Export Parquet storing each kv key selection as it's own directory.

```
In [2]:
         1 #//*** Load Parquet file into a Pandas Dataframe
         2 | df = pd.read parquet("routes.parquet")
         3
            #//*** Partition index based on first letter of IATA (3 letter airpor
         5 partitions = (
                    ('A', 'A'), ('B', 'B'), ('C', 'D'), ('E', 'F'),
         7
                    ('G', 'H'), ('I', 'J'), ('K', 'L'), ('M', 'M'),
                    ('N', 'N'), ('O', 'P'), ('Q', 'R'), ('S', 'T'),
         8
                    ('U', 'U'), ('V', 'V'), ('W', 'X'), ('Y', 'Z')
         9
        10
                )
        11
        12
            #//*** Returns the partition value based on the first letter of the i
        13
            def get partition key(val):
        14
        15
                #//*** Each entry is a dictionary. Get the first letter of the ia
```

0.1 + [2]

```
16
        letter = val[0]
17
18
        #//*** Loop through the Partitions to find letter value
19
        \#//*** (loople = Loop + Tuple)
20
        for loople in partitions:
21
            #//*** If Letter is found in either Tuple Value
22
            if letter == loople[0] or letter == loople[1]:
                \#//*** If both Tuple entries are the same, return the fir
23
24
                if loople[0] == loople[1]:
2.5
                    return loople[0]
26
                else:
27
                    #//*** Return both formatted tuples as a key
28
                    return f"{loople[0]}-{loople[1]}"
29
30
31
32 print("Length Before:", len(df))
33
34 #//*** remove Fields with Empty Airports and airlines
35 for col in ['src airport', 'dst airport', 'airline']:
36
37
        df['empty'] = df[col].apply(lambda x: type(x))
38
39
        df = df[df['empty'] != type(None)]
40
        print(col,len(df))
41
42 if 'empty' in df.columns:
43
        del df['empty']
44
45 print("Length After:", len(df))
46
47 #//*** Build Key by extracting and combining values from airports and
48 df['key'] = df['src airport'].apply(lambda x: x['iata'])
49 df['key'] += df['dst airport'].apply(lambda x: x['iata'])
50 df['key'] += df['airline'].apply(lambda x: x['icao'])
51
52
53 df['kv key'] = df['key'].apply(get partition key)
54
55 #//*** Double check we only only the partition values.
56 print(df['kv key'].unique())
57
58 #//*** Write everything to disk using parquet partitions
59 df.to parquet(str(kv dir), partition cols=['kv key'])
60
61 df
62
Length Before: 67663
src airport 67180
dst airport 66771
airline 66771
Length After: 66771
['A' 'C-D' 'E-F' 'G-H' 'K-L' 'M' 'N' 'O-P' 'S-T' 'U' 'B' 'I-J' 'Y-Z' '
0-R'
 'V' 'W-X']
```

3 of 13

	airline	src_airport	dst_airport	codeshare	equipment	key	kv_key
0	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2965.0, 'name': 'Sochi Internat	{'airport_id': 2990.0, 'name': 'Kazan Internat	False	[CR2]	AERKZNARD	Α
1	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2966.0, 'name': 'Astrakhan Airp	{'airport_id': 2990.0, 'name': 'Kazan Internat	False	[CR2]	ASFKZNARD	Α
2	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2966.0, 'name': 'Astrakhan Airp	{'airport_id': 2962.0, 'name': 'Mineralnyye Vo	False	[CR2]	ASFMRVARD	А
3	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2968.0, 'name': 'Chelyabinsk Ba	{'airport_id': 2990.0, 'name': 'Kazan Internat	False	[CR2]	CEKKZNARD	C-D
4	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2968.0, 'name': 'Chelyabinsk Ba	{'airport_id': 4078.0, 'name': 'Tolmachevo Air	False	[CR2]	CEKOVBARD	C-D
67658	{'airline_id': 4178, 'name': 'Regional Express	{'airport_id': 6334.0, 'name': 'Whyalla Airpor	{'airport_id': 3341.0, 'name': 'Adelaide Inter	False	[SF3]	WYAADLRXA	W-X
67659	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 4029.0, 'name': 'Domodedovo Int	{'airport_id': 2912.0, 'name': 'Manas Internat	False	[734]	DMEFRUIWA	C-D
67660	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 2912.0, 'name': 'Manas Internat	{'airport_id': 4029.0, 'name': 'Domodedovo Int	False	[734]	FRUDMEIWA	E-F
67661	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 2912.0, 'name': 'Manas Internat	{'airport_id': 2913.0, 'name': 'Osh Airport',	False	[734]	FRUOSSIWA	E-F
67662	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 2913.0, 'name': 'Osh Airport',	{'airport_id': 2912.0, 'name': 'Manas Internat	False	[734]	OSSFRUIWA	O-P

7b

```
In [3]:
        1 def hash_key(key):
         2
              m = hashlib.sha256()
         3
                m.update(str(key).encode('utf-8'))
         4
                return m.hexdigest()
         5
         6 #//*** Hash the Key Values
         7 | df['hashed'] = df['key'].apply(hash_key)
         9 #//*** Get the first character of the hash.
        10 df['hash key'] = df['hashed'].apply(lambda x: x[0])
        11
        12 | df.to_parquet(str(hash_dir), partition_cols=['hash_key'])
        13
        14 df
        15
```

Out[3]:

	airline	src_airport	dst_airport	codeshare	equipment	key	kv_key	
0	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2965.0, 'name': 'Sochi Internat	{'airport_id': 2990.0, 'name': 'Kazan Internat	False	[CR2]	AERKZNARD	А	ab
1	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2966.0, 'name': 'Astrakhan Airp	{'airport_id': 2990.0, 'name': 'Kazan Internat	False	[CR2]	ASFKZNARD	А	
2	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2966.0, 'name': 'Astrakhan Airp	{'airport_id': 2962.0, 'name': 'Mineralnyye Vo	False	[CR2]	ASFMRVARD	А	74
3	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2968.0, 'name': 'Chelyabinsk Ba	{'airport_id': 2990.0, 'name': 'Kazan Internat	False	[CR2]	CEKKZNARD	C-D	1
4	{'airline_id': 410, 'name': 'Aerocondor', 'ali	{'airport_id': 2968.0, 'name': 'Chelyabinsk Ba	{'airport_id': 4078.0, 'name': 'Tolmachevo Air	False	[CR2]	CEKOVBARD	C-D	
67658	{'airline_id': 4178, 'name': 'Regional Express	{'airport_id': 6334.0, 'name': 'Whyalla Airpor	{'airport_id': 3341.0, 'name': 'Adelaide Inter	False	[SF3]	WYAADLRXA	W-X	
67659	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 4029.0, 'name': 'Domodedovo Int	{'airport_id': 2912.0, 'name': 'Manas Internat	False	[734]	DMEFRUIWA	C-D	a٠

	airline	src_airport	dst_airport	codeshare	equipment	key	kv_key	
67660	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 2912.0, 'name': 'Manas Internat	{'airport_id': 4029.0, 'name': 'Domodedovo Int	False	[734]	FRUDMEIWA	E-F	
67661	{'airline_id': 19016, 'name': 'Apache Air', 'a	{'airport_id': 2912.0, 'name': 'Manas Internat	{'airport_id': 2913.0, 'name': 'Osh Airport',	False	[734]	FRUOSSIWA	E-F	
67662	{'airline_id': 19016, 'name': 'Apache Air',	{'airport_id': 2913.0, 'name': 'Osh Airport',	{'airport_id': 2912.0, 'name': 'Manas	False	[734]	OSSFRUIWA	O-P	е

7c

Assign a geographic location based on longitude. Identify the closest (ish) src_airport to 3 fixed points. Since we are using 3 fixed points. Since these points are located in the United States and the airports are global, measuring distance in a single dimension feels appropriate especially with a wide variance in distance across the data.

The earth is divided into zones of equal latitude between the points. Zones areassigned based on latitude. I could also have geohashed each airport and point, then assigned the airport to the point with the smallest distance. Which would account for distance across two dimensions.

```
#//*** Define Geo Locations by Longitude.
In [4]:
          3 #//*** Calculate the closest middle Longitude between two points.
            \#//*** This Calculates the boundaries for both sides of the Central L
          5 def boundary closest (primary, extant):
                return ((extant - primary) / 2) + primary
          8 | #//*** Calculate the Furthest middle longitude between two points
          9
            #//*** Invert the values by 180 degress, calculate the distance between
         10 def boundary furthest(coord1, coord2):
                 #//*** Convert
        11
                if coord1 < 0:</pre>
         12
         13
                     coord1 inverse = coord1 + 180
         14
                 else:
         15
                     coord1 inverse = coord1 - 180
                 if coord2 < 0:</pre>
         16
         17
                     coord2 inverse = coord2 + 180
         18
                 else:
         19
                     coord2_inverse = coord2 - 180
         20
         21
                 return ((coord2 inverse - coord1 inverse) / 2) + coord1 inverse
         22
         23 longitude ref = {
         24
                 "west" : -121.1786823,
         25
                 "central" : -96.0422378,
                 "east" : -77.6497145
         26
```

```
27 }
28
29 #//*** The central boundary is split evenly between the west and east
30 #//*** The west and east boundaries extend from the central boundary,
31 #//***
32 boundaries = {
33
        "west" : (
34
            boundary closest(longitude ref['central'],longitude ref['west
35
            boundary furthest(longitude ref['west'],longitude ref['east']
36
        ),
37
        "central" : (
38
            boundary closest(longitude ref['central'],longitude ref['west
39
            boundary closest(longitude ref['central'],longitude ref['east
40
        ),
        "east" : (
41
42
            boundary closest(longitude ref['central'],longitude ref['east
43
            boundary furthest(longitude ref['west'],longitude ref['east']
44
45 }
46
47 def get closest location(input val):
48
49
        #//*** Withing the Bound of central, then it's central
50
51
        if boundaries[col][0] < input val['longitude'] < boundaries[col]</pre>
52
            #print(f"{boundaries[col][0]} < {input val['longitude']} < {b</pre>
53
            return col
54
55
56
        if input val['longitude'] < 0:</pre>
57
58
            if input val['longitude'] < boundaries['west'][0]:</pre>
59
                return "west"
60
61
            else:
62
                return "east"
63
64
65
       else:
66
67
            if input val['longitude'] < boundaries['west'][1]:</pre>
                return "west"
68
69
            else:
70
                return "east"
71
72
73 df['location'] = df['src airport'].apply(get closest location)
74 df['longitude'] = df['src airport'].apply(lambda x:x['longitude'])
75
76 #//*** Double check our work, getting spaces within longitude values
   for group in df.groupby('location'):
78
        print(group[0], "Count: ", len(group[1]), " Boundaries - ",bounda
79
        #print(group[1][['longitude','location']])
        #print(group['src_airport'].apply(lambda x:x['longitude']))
80
81
82 df.to parquet(str(geo dir), partition cols=['location'])
```

```
83
84
central Count: 4904 Boundaries - (-108.61046005, -86.84597615) Min:
-108.54299926757812 - Max: -86.852997
east Count: 34507 Boundaries - (-86.84597615, 80.5858016) Min: -8
6.775100708008 - Max: 179.34100341799999
west Count: 27360 Boundaries - (-108.61046005, 80.5858016) Min: -1
79.87699890099998 - Max: 80.58190155029297
```

7d

Split an order list of keys across a variable partitions count.

Partitions should return starting value, ending value, and the list of keys. These properties are stored in a partition_class class.

```
In [5]:
         1
            class partition class():
          2
                 #//*** Format the class data on creation. Assumes data is already
          3
                def init (self, keys):
          4
                     self.start = keys[0]
          5
                     self.end = keys[-1]
                     self.keys = list(keys)
          6
          7
          8
                def start(self):
          9
                     return self.start
         10
         11
                def end(self):
         12
                    return self.end
         13
         14
                def keys(self):
         15
                     return self.keys
         16
         17
                 #//*** Nicely format for display printing
                 def repr__(self):
         18
                    out = "\n"
        19
         20
                     out += "start index: "
         21
                     out += self.start
                     out += "\n"
         22
         23
                     out += "end index:
        24
                     out += self.end
         25
                     out += "\n"
                     out += "keys: "
         26
         27
                     out += str(np.array(self.keys))
                    out += "\nLength: "
         28
         29
                     out += str(len(self.keys))
         30
                     out += "\n"
         31
         32
         33
                     return out
         34
         35
         36
         37
            #//*** Divides a sorted list of keys evenly(ish) across num partition
            def balance partitions(keys, num partitions):
```

```
39
       keys = list(keys)
40
41
       #//*** Divide the series by num partitions to get and equal(ish)
42
       index multiple = int(len(keys)/num partitions)
43
44
       partitions = []
45
46
       #//*** Build partition Indexes
47
       #//*** Slice the keys list by index values using the index multip
48
       for x in range(num partitions):
49
          if x+1 < num partitions:</pre>
50
              key list = keys[x*index multiple:(x+1)*index multiple]
51
          else:
52
              #//*** Last key, grab all values from index to the end
53
              key list = keys[x*index multiple:]
54
          #//*** Build Partition class from key list.
55
56
          #//*** Returns keys, start and End indexes
57
          partitions.append(partition class(key list))
58
59
       return partitions
60
61 #//*** Build a Sorted list of hashed keys
62 keys = list(np.sort(df['hashed'].unique()))
63
64 #//*** Return a list of partition class partitions
65 partitions = balance partitions(keys, 3)
66
67 print("========="")
68 print("Three Partition Example using hashes for Keys")
69 print("========="")
70 print(partitions)
71
72
73 print("========"")
74 print("Thirty Partition Example using key values")
75 print("========"")
76 keys = list(np.sort(df['key'].unique()))
77 partitions = balance partitions (keys, 30)
78 print(partitions)
79
_____
Three Partition Example using hashes for Keys
_____
start index: 000224e90d8451281c00829decf16594da6ec6c0082c22500266fa503
dc360dd
end index:
           550afaa93cc6218ae0f59875e4a976d3730770ce2f27112984cbdcaf6
deeba65
keys: ['000224e90d8451281c00829decf16594da6ec6c0082c22500266fa503dc360
 '00037d7d0a03a49f84d8623e5f6ecdcabdafc52f380987ac4f615b4ffe10d510'
 '00054897d2393efa4943eee23957d1478e5c06bb24d0829e79a1819afef9030a'
```

'5509ed25f3e91e1e763b24f3fbf4109f88074a7b487f078b85888134eba5bc92'

```
'550a947fe7e5d9e443e6d49e1769e8cb4d5ea4510b1b2e0341eed50d8c6548e9'
 '550afaa93cc6218ae0f59875e4a976d3730770ce2f27112984cbdcaf6deeba65'|
Length: 22246
start index: 550b286629660ccbb3e0058b23c5d897a484021b3f37bf83d522af6b8
5b8ff11
end index: aa13e81971aaf74f605428ff6354bc9a37ccdc18435e7a94be7f35029
6c87991
keys: ['550b286629660ccbb3e0058b23c5d897a484021b3f37bf83d522af6b85b8ff
11'
 '550b4f4c812b7aa2c186e97f64700a16ff3dff20e38a553c6d76819f83847200'
 '550b84860c57338d1cc907cbdad3b3a224895149bd269963135d6039dc755e0f'
 'aa12c7dc9ede07e1c62440b70a3e524b9f886e682654885818a8254f93021d92'
 'aa13afb85118d8f54b7566cb3c30db3daf67da137741d5af2d0932e81ea771af'
 'aa13e81971aaf74f605428ff6354bc9a37ccdc18435e7a94be7f350296c87991'l
Length: 22246
start index: aa18062b18c303463fd7e804fb20cd0358e894d5bf8ecd42f7d2df368
end index: fffdae6e206625e017d6d2f023f10e162105b2229aa5335f4f5827495
560fb81
keys: ['aa18062b18c303463fd7e804fb20cd0358e894d5bf8ecd42f7d2df36835e41
 'aa19db9c7dbccff9fc4a5bd12abc79ff9e7a27f4fe6f72c1b1f6e1661a2236b5'
 'aa1b8d348269d5d410bf5ed78c96e9cdb9309bab0f4a55834d1651dffa004702'
 'fffa9c5b989e152b4eadee787dda3ef306d0fbbbbc5240b62428a2653cb7e7d3'
 'fffc6056c61abad1444ddf0658ea367a646d3b1c7398e0275e5fbcac1bb3d87d'
 'fffdae6e206625e017d6d2f023f10e162105b2229aa5335f4f5827495560fb81'|
Length: 22247
_____
Thirty Partition Example using key values
_____
start index: AAEALGDAH
end index: AMSNDRRAM
keys: ['AAEALGDAH' 'AAECDGDAH' 'AAEISLDAH' ... 'AMSNCLKLM' 'AMSNDRKW1'
 'AMSNDRRAM']
Length: 2224
start index: AMSNRTKLM
end index: AVPPHLUSA
keys: ['AMSNRTKLM' 'AMSNTEAFR' 'AMSNTEKLM' ... 'AVPORDUAL' 'AVPPHLAAL'
 'AVPPHLUSA']
Length: 2224
start index: AVPSFBAAY
end index:
           BKKMELJST
keys: ['AVPSFBAAY' 'AVVSYDJST' 'AWDFTAAVN' ... 'BKKMDLETD' 'BKKMDLQTR'
 'BKKMELJST'l
Length: 2224
start index: BKKMELTHA
end index: BSBRECONE
```

```
keys: ['BKKMELTHA' 'BKKMELTHY' 'BKKMFMAMU' ... 'BSBRBRTAM' 'BSBRECCIX'
 'BSBRECONE']
Length: 2224
start index: BSBRECTAM
end index: CEKOSSSVR
keys: ['BSBRECTAM' 'BSBSDUCIX' 'BSBSDUONE' ... 'CEKNMASVR' 'CEKOSSFLZ'
 'CEKOSSSVR']
Length: 2224
start index: CEKOVBARD
end index: CNFCWBAZU
keys: ['CEKOVBARD' 'CEKOVBCRG' 'CEKPRGCSA' ... 'CNFCKSAZU' 'CNFCPVAZU'
'CNFCWBAZU']
Length: 2224
start index: CNFFORAZU
end index: DBVORYTVF
keys: ['CNFFORAZU' 'CNFGIGCIX' 'CNFGIGTAM' ... 'DBVMUCDLH' 'DBVNCLEXS'
'DBVORYTVF']
Length: 2224
start index: DBVOSICTN
end index: DMMISLTHY
keys: ['DBVOSICTN' 'DBVOSLNAX' 'DBVRJKCTN' ... 'DMMHBERBG' 'DMMISLSVA'
'DMMISLTHY']
Length: 2224
start index: DMMIXEAXB
end index: ELPPHLTRS
keys: ['DMMIXEAXB' 'DMMJEDKNE' 'DMMJEDSVA' ... 'ELPORDAAL' 'ELPORDUSA'
 'ELPPHLTRS']
Length: 2224
start index: ELPPHXAAL
end index: FRAKBPAUI
keys: ['ELPPHXAAL' 'ELPPHXSWA' 'ELPPHXUSA' ... 'FRAJNBSAA' 'FRAJNBUSA'
'FRAKBPAUI']
Length: 2224
start index: FRAKBPDLH
end index: GYNVCPAZU
keys: ['FRAKBPDLH' 'FRAKEFICE' 'FRAKGSCFG' ... 'GYNUDICGN' 'GYNUDIMRS'
'GYNVCPAZU']
Length: 2224
start index: GYSCANCCA
end index: HNLMAJUAL
keys: ['GYSCANCCA' 'GYSCANCSZ' 'GYSHGHCCA' ... 'HNLLNYHAL' 'HNLLNYMKU'
'HNLMAJUAL']
Length: 2224
start index: HNLMELJST
end index: ISLNBOAAR
keys: ['HNLMELJST' 'HNLMELQFA' 'HNLMKKHAL' ... 'ISLNAVTHY' 'ISLNBCKKK'
 'ISLNBOAAR']
```

```
Length: 2224
start index: ISLNBOTHY
end index: KHIRYKSAI
keys: ['ISLNBOTHY' 'ISLNCETHY' 'ISLNIMTHY' ... 'KHIRYKMXI' 'KHIRYKPIA'
'KHIRYKSAI']
Length: 2224
start index: KHISHJABY
end index: LASLAXVRD
keys: ['KHISHJABY' 'KHISHJPIA' 'KHISKZPIA' ... 'LASLAXUAL' 'LASLAXUSA'
'LASLAXVRD']
Length: 2224
start index: LASLBBSWA
end index: LHRLCACYP
keys: ['LASLBBSWA' 'LASLGBJBU' 'LASLGWAAL' ... 'LHRLCAAAL' 'LHRLCABAW'
'LHRLCACYP']
Length: 2224
start index: LHRLCGFOS
end index: MADGVASWR
keys: ['LHRLCGFOS' 'LHRLCGIBE' 'LHRLEDBAW' ... 'MADGVAEZY' 'MADGVAIBE'
'MADGVASWR']
Length: 2224
start index: MADGYEIBE
end index: MIACLTUSA
keys: ['MADGYEIBE' 'MADGYELAN' 'MADHAMGWI' ... 'MIACLOUSA' 'MIACLTAAL'
'MIACLTUSA']
Length: 2224
start index: MIACMHAAL
end index: MVYHPNKAP
keys: ['MIACMHAAL' 'MIACMHUSA' 'MIACNFAAL' ... 'MVYBOSKAP' 'MVYEWBKAP'
'MVYHPNKAP']
Length: 2224
start index: MWASTLKAP
end index:
           NTLMELJST
keys: ['MWASTLKAP' 'MWFSONAVN' 'MWXCJUAAR' ... 'NTLBNEVOZ' 'NTLBNKRXA'
'NTLMELJST']
Length: 2224
start index: NTLMELVOZ
end index: PAZVSAAMX
keys: ['NTLMELVOZ' 'NTLOOLJST' 'NTLSYDRXA' ... 'PAZREXAMX' 'PAZREXTAO'
'PAZVSAAMX']
Length: 2224
start index: PAZVSATAO
end index:
           PMOCDGISS
keys: ['PAZVSATAO' 'PBCCUNVOI' 'PBCDFWAAL' ... 'PMOCDGADH' 'PMOCDGAZA'
'PMOCDGISS']
Length: 2224
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start index: PMOCDGSEU
        end index: RHOLEDTSO
        keys: ['PMOCDGSEU' 'PMOCGNGWI' 'PMOCTATRA' ... 'RHOLEDAEE' 'RHOLEDAFL'
         'RHOLEDTSO'1
        Length: 2224
        start index: RHOLEJCFG
        end index: SFOPEKUSA
        keys: ['RHOLEJCFG' 'RHOLEJHLX' 'RHOLGGHMY' ... 'SFOPEKCCA' 'SFOPEKUAL'
         'SFOPEKUSA']
        Length: 2224
        start index: SFOPHLAAL
        end index: SPNPUSAAR
        keys: ['SFOPHLAAL' 'SFOPHLUAL' 'SFOPHLUSA' ... 'SPNNRTDAL' 'SPNPEKCES'
         'SPNPUSAAR'l
        Length: 2224
        start index: SPNPVGCSC
        end index: TACMNLCEB
        keys: ['SPNPVGCSC' 'SPNROPUAL' 'SPPLADDTA' ... 'TABPOSBWA' 'TACCEBCEB'
         'TACMNLCEB']
        Length: 2224
        start index: TACMNLPAL
        end index: TRNSUFADH
        keys: ['TACMNLPAL' 'TACMNLSRQ' 'TACMNLVNP' ... 'TRNREGAZA' 'TRNSTNRYR'
         'TRNSUFADH']
        Length: 2224
        start index: TRNSUFAZA
        end index: VKOFCOTSO
        keys: ['TRNSUFAZA' 'TRNTIAAZA' 'TRNTPSRYR' ... 'VKOEVNTSO' 'VKOEYKGZP'
         'VKOFCOTSO']
        Length: 2224
        start index: VKOFRADLH
        end index: YHZYYZACA
        keys: ['VKOFRADLH' 'VKOFRATSO' 'VKOGOJAEF' ... 'YHZYYTPOE' 'YHZYYTWJA'
         'YHZYYZACA']
        Length: 2224
        start index: YHZYYZKLM
        end index: ZYLDACVKH
        keys: ['YHZYYZKLM' 'YHZYYZWJA' 'YICKMGCGP' ... 'ZYLDACRPO' 'ZYLDACUBD'
         'ZYLDACVKH'l
In [ ]:
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