

Assignment 3

json schema Reference <https://json-schema.org/learn/getting-started-step-by-step.html>
(<https://json-schema.org/learn/getting-started-step-by-step.html>)

json schema library reference: <https://python-jjsonschema.readthedocs.io/en/stable/>
(<https://python-jjsonschema.readthedocs.io/en/stable/>)

Avro is a language-neutral data serialization system. It can be processed by many languages (currently C, C++, C#, Java, Python, and Ruby). Avro creates binary structured format that is both compressible and splittable. Hence it can be efficiently used as the input to Hadoop MapReduce jobs.

reference: https://www.tutorialspoint.com/avro/avro_overview.htm (https://www.tutorialspoint.com/avro/avro_overview.htm)

FastAvro Schema: <https://fastavro.readthedocs.io/en/latest/schema.html>
(<https://fastavro.readthedocs.io/en/latest/schema.html>)

FastAvro Home: <https://fastavro.readthedocs.io/en/latest/> (<https://fastavro.readthedocs.io/en/latest/>)

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/> (<https://www.pythontutorial.net/python-basics/python-check-if-file-exists/>)

Google Protocol Buffers: <https://developers.google.com/protocol-buffers/docs/pythontutorial>
(<https://developers.google.com/protocol-buffers/docs/pythontutorial>)

note: use .CopyFrom() when assigning a metaclass to a key.

gzip encoding example: <https://gist.github.com/LouisAmon/4bd79b8ab80d3851601f3f9016300ac4>
(<https://gist.github.com/LouisAmon/4bd79b8ab80d3851601f3f9016300ac4>)

Import libraries and define common helper functions

```
In [1]: 1 import os
        2 import sys
        3 import gzip
        4 import json
        5 from pathlib import Path
```

```

6 import csv
7
8 import pandas as pd
9 #import s3fs
10 import pyarrow as pa
11 from pyarrow.json import read_json
12 import pyarrow.parquet as pq
13 import fastavro
14 import pygeohash
15 #!/*** Note: install with: pip install python-snappy
16 import snappy
17 import jsonschema
18 from jsonschema.exceptions import ValidationError
19
20
21 endpoint_url='https://storage.budsc.midwest-datascience.com'
22
23 current_dir = Path(os.getcwd()).absolute()
24 schema_dir = current_dir.joinpath('schemas')
25 results_dir = current_dir.joinpath('results')
26 results_dir.mkdir(parents=True, exist_ok=True)
27
28 validation_csv_path = results_dir.joinpath("json_schema_validation.csv")
29
30 def read_jsonl_data():
31     src_data_path = 'routes.jsonl.gz'
32
33     with gzip.open(src_data_path, 'rb') as f:
34         records = [json.loads(line) for line in f.readlines()]
35
36     return records

```

Load the records from <https://storage.budsc.midwest-datascience.com/data/processed/openflights/routes.jsonl.gz> (<https://storage.budsc.midwest-datascience.com/data/processed/openflights/routes.jsonl.gz>)

In [2]: `records = read_jsonl_data()`

Remove Record Keys with None Data types

Some of the SRC and DST airports are Empty/None. This causes issues with the Schema Validation. It's fine to have errors for this assignment, but might as well address the issue before validating the schema. Probably could have set the schema to optional as well.

In [3]:

```

1 #!/*** Remove Records with None Type
2 for record in records:
3     empty_keys = []
4
5     for key,value in record.items():
6         if value is None:
7             empty_keys.append(key)
8     for empty_key in empty_keys:
9         del record[empty_key]

```

Programatically Build JSON Schema

Parsing each value of a record to generate a schema probably didn't save me any time. But it might be helpful for future tasks. Rolling through programatically means I won't miss any keys and my typos will be consistent.

```
In [4]: 1  def type_as_string(val):
2         if isinstance(val, int):
3             return "integer"
4
5         if isinstance(val, str):
6             return "string"
7
8         if isinstance(val, bool):
9             return "boolean"
10
11        if isinstance(val, float):
12            return "number"
13
14        if isinstance(val, list):
15            return "array"
16
17        return type(val)
18
19  #!/*** Pick an index to build the schema
20  dex=0
21
22  out = ''
23  out+= '{'
24  #out+= '\n\t'
25  #out += ' "$schema": "https://json-schema.org/draft/2020-12/schema", '
26  out+= '\n\t'
27  out += ' "$id": "http://json-schema.org/draft-07/schema#", '
28  out+= '\n\t'
29  out += ' "$schema": "http://json-schema.org/draft-07/schema#", '
30  out+= '\n\t'
31  out += ' "title": "Product", '
32  out+= '\n\t'
33  out += ' "description": "Some Product", '
34  out+= '\n\t'
35  out += ' "type": "object", '
36  out+= '\n\t'
37  out += ' "properties": {'
38  #out+= '\n\t\t'
39  for key in records[dex].keys():
40      #print(key, isinstance(records[0][key], dict) )
41
42      if isinstance(records[dex][key], dict):
43          out+= '\n\t\t\t'
44          #print(key)
45          out += f' "{key}" : '
46          out += '{'
47          out+= '\n\t\t\t\t'
48          out+= ' "type": "object", '
```

```

49         out+='\n\t\t\t\t\t'
50         out += '"properties": {'
51         out+='\n\t\t\t\t\t\t\t'
52         for key2,value2 in records[dex][key].items():
53             out += f'"{key2}" : '
54             out += "{"
55             out+='\n\t\t\t\t\t\t\t\t\t\t\t'
56             if key2 == 'active':
57                 out += f'"type": "boolean"'
58             else:
59                 out += f'"type": "{type_as_string(value2)}"'
60             out+='\n\t\t\t\t\t\t\t\t\t\t\t'
61             out += "}, "
62             if key == "airline" and key2 == "active":
63                 out = out[:-1]
64                 continue
65             if key == "src_airport" and key2 == "source":
66                 out = out[:-1]
67                 continue
68
69             if key == "dst_airport" and key2 == "source":
70                 out = out[:-1]
71                 continue
72
73             out+='\n\t\t\t\t\t\t\t\t\t\t\t'
74             out+='\n\t\t\t\t\t\t\t\t\t\t\t'
75             out+="}"
76             out+='\n\t\t\t\t\t\t\t\t\t\t\t'
77             out += "}, "
78             continue
79
80         out+='\n\t\t\t\t\t'
81         out += f'"{key}" : '
82         out += "{"
83         out+='\n\t\t\t\t\t\t\t\t\t\t\t'
84
85         if key == 'codeshare':
86             out += f'"type": "boolean"'
87         else:
88             out += f'"type": "{type_as_string(records[dex][key])}"'
89         out+='\n\t\t\t\t\t\t\t\t\t\t\t'
90         out+="}, "
91
92     out = out[:-1]
93     out+='\n\t\t\t\t\t'
94     out+= "}"
95     out+='\n'
96     out+= "}"
97     print(out)
98
99     #!/*** Write Schema to File
100     schema_path = schema_dir.joinpath('routes-schema.json')
101     with open(schema_path, 'w') as f:
102         f.write(out)

```

```

{
    "$id": "http://json-schema.org/draft-07/schema#",

```

```

"$schema": "http://json-schema.org/draft-07/schema#",
"title": "Product",
"description": "Some Product",
"type": "object",
"properties": {
    "airline" : {
        "type": "object",
        "properties": {
            "airline_id" : {
                "type": "integer"
            },
            "name" : {
                "type": "string"
            },
            "alias" : {
                "type": "string"
            },
        },
    },
}

```

3.1.a JSON Schema

```

In [5]: 1 def validate_jsonl_data(records):
2         schema_path = schema_dir.joinpath('routes-schema.json')
3
4         with open(schema_path) as f:
5             schema = json.load(f)
6
7         with open(validation_csv_path, 'w') as f:
8             for i, record in enumerate(records):
9                 try:
10                    jsonschema.validate(record, schema)
11                    f.write(f"{i},valid,\n")
12
13                except ValidationError as e:
14                    ## Print message if invalid record
15                    print("Schema/Record Error Record:", i, "\n\n", e, "\n\n")
16
17 #!/*** All Data is Schema valid
18 validate_jsonl_data(records)

```

3.1.b Avro

```

In [8]: 1 #!/*** Reload Clean Records
2 records = read_jsonl_data()
3
4
5 from fastavro import parse_schema
6 from fastavro import writer
7
8 def create_avro_dataset(records):
9     schema_path = schema_dir.joinpath('routes.avsc')
10    data_path = results_dir.joinpath('routes.avro')
11
12    #!/*** Load Avro Schema
13    with open(schema_path, 'r') as f:

```

```

14         avro_schema = json.loads(f.read())
15
16     #!/*** Parse Avro Schema
17     parsed_schema = parse_schema(avro_schema)
18
19     with open(data_path, 'wb') as out:
20         writer(out, parsed_schema, records)
21
22     create_avro_dataset(records)

```

3.1.c 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/> (<https://www.pythontutorial.net/python-basics/python-check-if-file-exists/>)

```

In [9]: 1 def create_parquet_dataset():
2         from pyarrow import json
3         import os
4
5         parquet_output_path = results_dir.joinpath('routes.parquet')
6
7         #!/*** PyArrow supports native JSONL files
8         #!/*** Extract the compressed JSONL files to disk
9         src_data_path = 'routes.jsonl.gz'
10        jsonl_path = 'routes.jsonl'
11
12        #!/*** Open the compressed file
13        with open(src_data_path, 'rb') as f:
14
15            #!/*** Open the extracted file for writing
16            with open(jsonl_path, 'wb') as writer:
17
18                #!/*** Write the decompressed jsonl file
19                writer.write(gzip.decompress(f.read()))
20
21        #!/*** Load the jsonl file into a parquet table
22        parquet_table = json.read_json(jsonl_path)
23
24        #!/*** Delete the Extracted File
25        if os.path.exists(jsonl_path):
26            os.remove(jsonl_path)
27
28        #!/*** Print the First 5000 characters of the string output of pa
29        print(str(parquet_table)[:5000])
30

```

```

31     #!/*** Write Parquet Table to disk
32     pq.write_table(parquet_table,parquet_output_path)
33
34
35
pyarrow.Table<struct dataset>
  airline: struct<airline_id: int64, name: string, alias: string, iata:
string, icao: string, callsign: string, country: string, active: bool>
    child 0, airline_id: int64
    child 1, name: string
    child 2, alias: string
    child 3, iata: string
    child 4, icao: string
    child 5, callsign: string
    child 6, country: string
    child 7, active: bool
  src_airport: struct<airport_id: int64, name: string, city: string, cou
ntry: string, iata: string, icao: string, latitude: double, longitude:
double, altitude: int64, timezone: double, dst: string, tz_id: string,
type: string, source: string>
    child 0, airport_id: int64
    child 1, name: string
    child 2, city: string
    child 3, country: string
    child 4, iata: string

```

3.1.d Protocol Buffers

```
In [10]: 1 #!/*** Reload Clean Records Data
```

```
In [87]: 1 sys.path.insert(0, os.path.abspath('routes_pb2'))
2
3 import routes_pb2
4
5 def _airport_to_proto_obj(airport):
6     obj = routes_pb2.Airport()
7     if airport is None:
8         return None
9     if airport.get('airport_id') is None:
10        return None
11
12    obj.airport_id = airport.get('airport_id')
13    if airport.get('name'):
14        obj.name = airport.get('name')
15    if airport.get('city'):
16        obj.city = airport.get('city')
17    if airport.get('iata'):
18        obj.iata = airport.get('iata')
19    if airport.get('icao'):
20        obj.icao = airport.get('icao')
21    if airport.get('altitude'):
22        obj.altitude = airport.get('altitude')
23    if airport.get('timezone'):
24        obj.timezone = airport.get('timezone')
25    if airport.get('dst'):

```

```
26         obj.dst = airport.get('dst')
27     if airport.get('tz_id'):
28         obj.tz_id = airport.get('tz_id')
29     if airport.get('type'):
30         obj.type = airport.get('type')
31     if airport.get('source'):
32         obj.source = airport.get('source')
33
34     obj.latitude = airport.get('latitude')
35     obj.longitude = airport.get('longitude')
36
37     return obj
38
39
40 def _airline_to_proto_obj(airline):
41
42
43     obj = routes_pb2.Airline()
44
45     #!/*** If key exists, load value into obj
46     if airline.get('airline_id'):
47         obj.airline_id = airline.get('airline_id')
48
49     if airline.get('name'):
50         obj.name = airline.get('name')
51
52     if airline.get('alias'):
53         obj.alias = airline.get('alias')
54
55     if airline.get('iata'):
56         obj.iata = airline.get('iata')
57
58     if airline.get('icao'):
59         obj.icao = airline.get('icao')
60
61     if airline.get('callsign'):
62         obj.callsign = airline.get('callsign')
63
64     if airline.get('country'):
65         obj.country = airline.get('country')
66
67     if 'active' in airline.keys():
68         obj.active = airline['active']
69
70     return obj
71
72
73 def create_protobuf_dataset(records):
74     routes = routes_pb2.Routes()
75
76
77     for record in records:
78
79         #!/*** Add a Record to routes
80         route = routes.route.add()
81
```



```

82         if 'codeshare' in record.keys():
83             route.codeshare = record['codeshare']
84
85         if record.get('stops'):
86             route.stops = record.get('stops')
87
88         ##### Use extend to add lists/arrays.
89         if record.get('equipment'):
90             route.equipment.extend(record.get('equipment'))
91
92         ##### generate Airline Object
93         if 'src_airport' in record.keys():
94
95             ##### If src_airport exists Build Object from record
96             src_airport = _airport_to_proto_obj(record['src_airport'])
97
98             ##### Skip if None
99             if src_airport is not None:
100                 ##### Use CopyFrom to assign objects
101                 route.src_airport.CopyFrom(src_airport)
102
103         if 'dst_airport' in record.keys():
104
105             ##### If dst_airport exists Build Object from record
106             dst_airport = _airport_to_proto_obj(record['dst_airport'])
107
108             ##### Skip if None
109             if dst_airport is not None:
110                 ##### Use CopyFrom to assign objects
111                 route.dst_airport.CopyFrom(dst_airport)
112
113         if 'airline' in record.keys():
114             ##### If airline exists Build Object from record
115             airline = _airline_to_proto_obj(record['airline'])
116
117             ##### Skip if None
118             if airline is not None:
119                 ##### Use CopyFrom to assign objects
120                 route.airline.CopyFrom(airline)
121
122         ##### Display the first 10,000 characters of routes
123         print(str(routes)[:10000])
124
125         data_path = results_dir.joinpath('routes.pb')
126
127         with open(data_path, 'wb') as f:
128             f.write(routes.SerializeToString())
129
130         compressed_path = results_dir.joinpath('routes.pb.snappy')
131
132         with open(compressed_path, 'wb') as f:
133             f.write(snappy.compress(routes.SerializeToString()))
134
135
136 @create_protobuf_dataset(records)
137 def create_protobuf_dataset(records):
138     airline {

```

```

    airline_id: 410
    name: "Aerocondor"
    alias: "ANA All Nippon Airways"
    iata: "2B"
    icao: "ARD"
    callsign: "AEROCONDOR"
    country: "Portugal"
    active: true
  }
  src_airport {
    airport_id: 2965
    name: "Sochi International Airport"
    city: "Sochi"
    iata: "AER"
    icao: "URSS"
    latitude: 43.449902
    longitude: 39.9566
  }

```

3.1e Size Comparison

```

In [154]: 1 src_data_path = 'routes.jsonl.gz'
          2
          3 #!/*** Get Filesize of Compressed JSON
          4 json_compressed_file_size = os.path.getsize(src_data_path)
          5
          6
          7 jsonl_path = 'routes.jsonl'
          8 #!/*** Open the compressed file
          9 with open(src_data_path, 'rb') as f:
          10     #!/*** Open the extracted file for writing
          11     with open(jsonl_path, 'wb') as writer:
          12         #!/*** Write the decompressed jsonl file
          13         writer.write(gzip.decompress(f.read()))
          14
          15 #!/*** Get Filesize of Compressed JSON
          16 json_uncompressed_file_size = os.path.getsize(jsonl_path)
          17
          18 #!/*** Delete the Extracted File
          19 if os.path.exists(jsonl_path):
          20     os.remove(jsonl_path)
          21
          22 #!/*** Get Avro File size
          23 avro_path = results_dir.joinpath('routes.avro')
          24 avro_file_size = os.path.getsize(avro_path)
          25
          26 parquet_output_path = results_dir.joinpath('routes.parquet')
          27 parquet_file_size = os.path.getsize(parquet_output_path)
          28
          29 pb_path = results_dir.joinpath('routes.pb')
          30 pb_file_size = os.path.getsize(pb_path)
          31
          32 compressed_pb_path = results_dir.joinpath('routes.pb.snappy')
          33 compressed_pb_file_size = os.path.getsize(compressed_pb_path)
          34

```

```

35 print("JSON Compressed File Size: ",format(json_c
36 print("JSON Uncompressed File Size: ",format(json_u
37 print("Avro Encoded File Size: ",format(avro_f
38 print("Parquet Encoded File Size: ",format(parque
39 print("Protocol Buffer File Size: ",format(pb_fil
40 print("Protocol Buffer (Snappy Compressed) File Size: ",format(compre
41
42 out = ""
43 out += f"JSON,compressed,{json_compressed_file_size}\n"
44 out += f"JSON,uncompressed,{json_uncompressed_file_size}\n"
45 out += f"Avro,uncompressed,{avro_file_size}\n"
46 out += f"Parquet,uncompressed,{parquet_file_size}\n"
47 out += f"Protocol Buffer,uncompressed,{pb_file_size}\n"
48 out += f"Protocol Buffer,compressed,{compressed_pb_file_size}\n"
49
50 comparision_path = results_dir.joinpath('comparison.csv')
51 print("=====
52 print("Writing Results to ./results/comparison.csv")
53
54 with open(comparision_path,'w') as writer:
55     writer.write(out)
56
57

```

```

JSON Compressed File Size: 3,327,145 bytes
JSON Uncompressed File Size: 59,109,449 bytes
Avro Encoded File Size: 19,646,227 bytes
Parquet Encoded File Size: 1,975,465 bytes
Protocol Buffer File Size: 22,523,154 bytes
Protocol Buffer (Snappy Compressed) File Size: 3,762,689 bytes
=====
=====
Writing Results to ./results/comparison.csv

```

3.2

3.2.a Simple Geohash Index

In [156]:

```

1 #!/*** Load a clean copy of records
2 records = read_clean_data()

```

In [88]:

```

1 #!/*** Reimport json lest we get confused with parquet json loader
2 import json
3
4 #!/*****
5 #!/*** Crawl each record and generate a dictionary that maps the fold
6 #!/*** Parse the dictionary map to generate the needed files and fold
7 #!/*****
8 def create_hash_dirs(records):
9     geoindex_dir = results_dir.joinpath('geoindex')
10    geoindex_dir.mkdir(exist_ok=True, parents=True)
11    hashes = []
12
13    airport_hash_dict = {}

```

```
14     airport_hashmap = {}
15
16     #!/*** Generate geohashes for each airport in src_destinations
17     #!/*** geohashes are stored in hashes for sorting
18     #!/*** and airport_hash_dict to associate the name with the geohas
19     for record in records:
20
21         if record['src_airport'] is None:
22             continue
23
24         airport_geohash = pygeohash.encode(record['src_airport']['lat
25         if airport_geohash not in airport_hash_dict.keys():
26             #print(record['src_airport']['name'], " - ", airport_geohas
27
28             #!/*** Add to hashes if airport is unique.
29             hashes.append(airport_geohash)
30
31             #!/*** Add Airport_geohash to dictionary.
32             #!/*** This associates the airport name with the geohash
33             airport_hash_dict[airport_geohash] = record['src_airport'
34
35             #!/*** add the geohash to the airport_hashmap dictionary
36             key1 = airport_geohash[:1]
37             key2 = airport_geohash[:2]
38             key3 = airport_geohash[:3]
39
40             #!/*** Initialize Keys as needed
41             if key1 not in airport_hashmap.keys():
42                 airport_hashmap[key1] = {}
43
44             if key2 not in airport_hashmap[key1].keys():
45                 airport_hashmap[key1][key2] = {}
46
47             if key3 not in airport_hashmap[key1][key2].keys():
48                 airport_hashmap[key1][key2][key3] = {}
49
50             #!/*** Associate the whole Airport record with the Geohas
51             #!/*** We'll keep everything together. We could also just
52             #!/*** the airport info in a separate dictionary/database
53             airport_hashmap[key1][key2][key3][airport_geohash] = reco
54
55     #!/*****
56     #!/*** END record in records
57     #!/*****
58
59     #!/*****
60     #!/*** Parse hashmap, Build directories and json files
61     #!/*****
62     #!/*** Top Level - Level 1
63     for key1, values1 in airport_hashmap.items():
64
65         #!/*** Build Levell1 Folders as needed
66         levell1_path = geoindex_dir.joinpath(key1)
67         levell1_path.mkdir(exist_ok=True, parents=True)
68
69         print(key1, levell1_path)
```

```

70
71     #!/*** Loop through Level2 sub folders
72     for key2, values2 in airport_hashmap[key1].items():
73
74         #!/*** Build Level2 Folders as needed
75         level2_path = level1_path.joinpath(key2)
76         level2_path.mkdir(exist_ok=True, parents=True)
77
78         #!/*** Only Print Top 2 Levels for display
79         print("--", key2, level2_path)
80
81         #!/*** Loop through Level3 - File Level
82         for key3, values3 in airport_hashmap[key1][key2].items():
83
84             filepath = level2_path.joinpath(f"{key3}.json.gz")
85             #!/*** Generate JSON String
86             json_data = json.dumps(values3)
87
88             #!/*** Encode JSON data as bytes
89             encoded = json_data.encode('utf-8')
90
91             #!/*** Compress encoded file and write to disk
92             with open(filepath, 'wb') as f:
93                 f.write(gzip.compress(encoded))
94
95 airport_hashmap = create_hash_dirs(records)
96 s C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoinde
97 x\s
98 -- sz C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
99 ndex\s\sz
100 -- s1 C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
101 ndex\s\s1
102 -- s4 C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
103 ndex\s\s4
104 -- sr C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
105 ndex\s\sr
106 -- sw C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
107 ndex\s\sw
108 -- su C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
109 ndex\s\su
110 -- sp C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
111 ndex\s\sp
112 -- s0 C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
113 ndex\s\s0
114 -- sf C:\Users\family\DSCProjects\DSC\DSC650\assignment03\results\geoi
115 ndex\s\s0

```

3.2.b Simple Search Feature

```

In [130]: 1 def airport_search(latitude, longitude, distance=150):
2
3         #!/*** Distance in kilometers
4
5         geoindex_dir = results_dir.joinpath('geoindex')
6
7         tgt_geohash = pygeohash.encode(latitude, longitude)

```

```
8
9     level1 = tgt_geohash[:1]
10    level2 = tgt_geohash[:2]
11
12    folderpath = geoindex_dir.joinpath(level1).joinpath(level2)
13
14    #!/*** If Filepath doesn't exist, blame the user!
15    if os.path.exists(folderpath) == False:
16        print("There are no airports near these coordinates")
17        return
18
19    #!/*** Get a list of files in the folder path
20    files = os.listdir(folderpath)
21
22    airport_dict = {}
23
24    airports_in_range = []
25
26    #!/*** Load all airports into a dictionary
27    for file in files:
28
29        filepath = folderpath.joinpath(file)
30
31        #!/*** Decode compressed JSON file.
32        with gzip.open(filepath, 'rb') as f:
33
34            #!/*** Open each file and add to dictionary
35            for key, value in json.loads(f.read().decode()).items():
36                airport_dict[key] = value
37
38            #!/*** Find the Distance and add to dist_dict.
39            #!/*** Makes it easier to search by distance
40            airport_distance = int(pygeohash.geohash_approximate_
41
42            #!/*** If Airport_Distance is less than Target distan
43            if airport_distance <= distance:
44                airports_in_range.append(key)
45
46
47
48
49
50    #for key,value in dist_dict.items():
51    #     print(tgt_geohash,key,value,airport_dict[key]['name'],airpor
52
53    print(f"There are {len(airports_in_range)} airports within {dista
54    for index, dst_geohash in enumerate(airports_in_range):
55        print(f"{index+1}).) {int(pygeohash.geohash_approximate_distan
56
57
58    print()
59
60
61
62
63 airport_search(41.1499988, -95.91779)
```

```
64
65 print("Search Near the San Francisco Bay Area")
66 airport_search(37.59592,-122.01375)
67
68 print("Search airports near Berlin, DE")
69 airport_search(52.52246,13.40457)
70
71 print("Search airports near Dubai, UAE")
72 airport_search(25.19721,55.26848)
73
```

There are 2 airports within 150km of (41.1499988, -95.91779)

- 1.) 19km Eppley Airfield, Omaha Region: America/Chicago
- 2.) 123km Lincoln Airport, Lincoln Region: America/Chicago

Search Near the San Francisco Bay Area

There are 5 airports within 150km of (37.59592, -122.01375)

- 1.) 123km Monterey Peninsula Airport, Monterey Region: America/Los_Angeles
- 2.) 123km Metropolitan Oakland International Airport, Oakland Region: America/Los_Angeles
- 3.) 123km Norman Y. Mineta San Jose International Airport, San Jose Region: America/Los_Angeles
- 4.) 123km Stockton Metropolitan Airport, Stockton Region: America/Los_Angeles
- 5.) 123km Modesto City Co-Harry Sham Field, Modesto Region: America/Los_Angeles

Search airports near Berlin, DE

There are 2 airports within 150km of (52.52246, 13.40457)

- 1.) 123km Berlin-Tegel Airport, Berlin Region: Europe/Berlin
- 2.) 123km Berlin-Schönefeld Airport, Berlin Region: Europe/Berlin

Search airports near Dubai, UAE

There are 3 airports within 150km of (25.19721, 55.26848)

- 1.) 123km Al Maktoum International Airport, Dubai Region: Asia/Dubai
- 2.) 19km Dubai International Airport, Dubai Region: Asia/Dubai
- 3.) 123km Al Ain International Airport, Al Ain Region: Asia/Dubai