# Guild\_Project

December 16, 2021

## 1 Import Dependencies

```
[1]: import pandas as pd
from pathlib import Path
import psycopg2
from psycopg2 import OperationalError
from dotenv import load_dotenv
import os
from IPython.display import IFrame
```

#### 1.1 Instructions

```
[2]: p = Path('Analytics_Engineer_Candidate_Project.pdf')
IFrame(p, width=800, height=1075)
```

- [2]: <IPython.lib.display.IFrame at 0x1b76475f788>
  - 1.1.1 Create a quick diagram for how you think these tables (tabs) are related (i.e. what is one to many, many to many, etc.)

See here for diagram creation: https://app.gleek.io/diagrams/cFdr3Sx9K712pnUQgTEGsg

```
[3]: q = Path('Guild_Education_SQL_ER_Diagram.png')
IFrame(q, width=1350, height=650)
```

- [3]: <IPython.lib.display.IFrame at 0x1b764770508>
  - 1.1.2 Create a single table to be used for analysis by joining these sources (include your SQL code, and document any issues you may encounter with the data, and any assumptions you make).

Load Postegres Password from .env File

To download PostgreSQL: https://www.enterprisedb.com/downloads/postgres-postgresql-downloads

Postgres password saved in file .env: db\_password = 'THE\_POSTGRES\_PASSWORD\_HERE'



### Technical Project

## **Data Compilation**

The <u>Guild Education SQL</u> workbook contains fake data similar to what exists in Guild's internal database. Each tab represents one table. Please make a copy of the workbook, and using the tables provided:

- Create a quick diagram for how you think these tables (tabs) are related (i.e. what is one to many, many to many, etc.)
- Create a single table to be used for analysis by joining these sources (include your SQL code, and document any issues you may encounter with the data, and any assumptions you make).

#### **Data Understanding & Insights**

Use your table to pull the following information (provide 1 query per question and your corresponding answer). Please state any of your assumptions. **SQL is required.** 

- Total number of contacts (students) who are not enrolled in any courses.
- For each program category count the number of distinct contacts (students) that are enrolled in courses.
- Based on your best interpretation of the data, which application type has the most number of successful students?

#### **Data Structures**

• What ideas do you have, if any, to better structure the data?





Contact\_Details

varchar18 Sf\_Contact\_ID

varchar18 Sf\_Opportunity\_ID

varchar18 Sf\_Course\_C\_ID

```
[4]: load_dotenv()
      db_password = os.getenv("db_password")
 [5]: # db_password
 [6]: def create_connection(db_name, db_user, db_password, db_host, db_port):
          connection = None
          try:
              connection = psycopg2.connect(
                  database=db_name,
                  user=db_user,
                  password=db_password,
                  host=db_host,
                  port=db_port,
              print("Connection to PostgreSQL DB successful")
          except OperationalError as e:
              print(f"The error '{e}' occurred")
          return connection
 [7]: connection = create_connection(
          "postgres", "postgres", db_password, "127.0.0.1", "5432"
     Connection to PostgreSQL DB successful
 [8]: def create_database(connection, query):
          connection.autocommit = True
          cursor = connection.cursor()
          try:
              cursor.execute(query)
              print("Query executed successfully")
          except OperationalError as e:
              print(f"The error '{e}' occurred")
 [9]: create_database_query = "CREATE DATABASE guild_education_sql" # make sure to__
       →use lower case
[10]: try:
          create_database(connection, create_database_query)
      except:
          print('This database already exists.')
     This database already exists.
[98]: connection = create_connection(
          "guild_education_sql", "postgres", db_password, "127.0.0.1", "5432"
      )
```

Connection to PostgreSQL DB successful

```
[14]: def execute_query(connection, query):
           connection.autocommit = True
           cursor = connection.cursor()
           try:
               cursor.execute(query)
               print("Query executed successfully")
           except OperationalError as e:
               print(f"The error '{e}' occurred")
      Create course details Table
[99]: create_course_details_table = """
       CREATE TABLE IF NOT EXISTS course details (
           "Sf Course C ID" VARCHAR(18) PRIMARY KEY,
           "Sf Course C Name" VARCHAR(75),
           "Sf Course C Course Start Date C Date" VARCHAR(10),
           "Sf Course C Course End Date C Date" VARCHAR(10),
           "Sf Course C Final Grade C" VARCHAR(75)
       11 11 11
[100]: try:
           execute_query(connection, create_course_details_table)
       except:
           print('This table already exists.')
      Query executed successfully
      Import .csv Data Into course_details Table
[101]: | Course_Details = Path(str(Path.cwd()) + '/' + 'data/Course_Details.csv')
       print(str(Course_Details))
      C:\Users\mchar\Downloads\Guild_Interview_Project\data\Course_Details.csv
[103]: import_course_details_data = """
       COPY course_details
       FROM '{}'
       DELIMITER ','
       CSV HEADER;
       """.format(str(Course_Details))
[105]: execute_query(connection, import_course_details_data)
       # If an error gets thrown change the permissions to 'Everyone' -> 'Full control'
       → in properties of the file (if using Windows).
       # Use chmod if using macOS or Linux distro.
```

Query executed successfully

```
Create opportunity_details Table
```

Query executed successfully

Import .csv Data Into opportunity\_details Table

```
[138]: Opportunity_Details = Path(str(Path.cwd()) + '/' + 'data/Opportunity_Details.

csv')

print(str(Opportunity_Details))
```

C:\Users\mchar\Downloads\Guild\_Interview\_Project\data\Opportunity\_Details.csv

```
[139]: import_opportunity_details_data = """
    COPY opportunity_details
    FROM '{}'
    DELIMITER ','
    CSV HEADER;
    """.format(str(Opportunity_Details))
```

```
[140]: execute_query(connection, import_opportunity_details_data)

# If an error gets thrown change the permissions to 'Everyone' ->'Full control'under the properties of the file (if using Windows).

# Use chmod if using macOS or Linux distro.
```

Query executed successfully

#### Create contact\_details Table

Query executed successfully

Import .csv Data Into contact\_details Table

```
[143]: Contact_Details = Path(str(Path.cwd()) + '/' + 'data/Contact_Details.csv')
print(str(Contact_Details))
```

C:\Users\mchar\Downloads\Guild\_Interview\_Project\data\Contact\_Details.csv

```
[144]: import_contact_details_data = """
    COPY contact_details
    FROM '{}'
    DELIMITER ','
    CSV HEADER;
    """.format(str(Contact_Details))
```

```
[145]: execute_query(connection, import_contact_details_data)

# If an error gets thrown change the permissions to 'Everyone' →'Full control'

→ in properties of the file (if using Windows).

# Use chmod if using macOS or Linux distro.
```

Query executed successfully

#### Join the Tables Into a Single Table

```
[189]: join_query = """
       CREATE TABLE single_table AS
       SELECT
           contact_details."Sf Contact ID",
           contact_details. "Sf Course C ID",
           contact_details."Sf Opportunity ID",
           course_details."Sf Course C Name",
           course_details."Sf Course C Course Start Date C Date",
           course_details."Sf Course C Course End Date C Date",
           course_details."Sf Course C Final Grade C",
           opportunity_details."Sf Opportunity Application Type C",
           opportunity_details."Sf Opportunity Program Category",
           opportunity_details."Sf Opportunity Program C"
       FROM contact details
       FULL OUTER JOIN course_details
       ON contact_details."Sf Course C ID" = course_details."Sf Course C ID"
       FULL JOIN opportunity_details
       ON contact_details."Sf Opportunity ID" = opportunity_details."Sf Opportunity_
       →ID";
       0.00
```

```
[190]: try:
           execute_query(connection, join_query)
       except:
           print('This table already exists.')
      Query executed successfully
      Verify single_table Creation
[154]: def execute read query(connection, query):
           cursor = connection.cursor()
           result = None
           try:
               cursor.execute(query)
               result = cursor.fetchall()
               return result
           except OperationalError as e:
               print(f"The error '{e}' occurred")
[191]: select_single_table = """
       SELECT * FROM single_table
[192]: | this_query = execute_read_query(connection, select_single_table)
[193]: | incrementor = 0
       while incrementor < 10:
           print(this_query[incrementor])
           incrementor += 1
      ('0033600000q4ADDAA2', None, '00636000005dxASAAY', None, None, None, None,
      'Guild Education', 'Lead Gen - Post Secondary', 'Giving and Receiving Feedback')
      ('0033600000BMcisAAD', None, '00636000005eG7BAAU', None, None, None, None,
      'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies
      ('00336000009m01JAAQ', None, '00636000005eGPxAAM', None, None, None, None,
      'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies
      ('0033600000B0I13AAH', None, '00636000005eNIpAAM', None, None, None, None,
      'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies
      ('0033600000BNSXNAA5', None, '00636000005eOcBAAU', None, None, None, None,
      'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies
      ('0033600000BYnWzAAL', None, '00636000005eZYRAA2', None, None, None, None,
      'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies
      ('0033600000BYnXdAAL', None, '00636000005eZZcAAM', None, None, None, None,
      'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies
```

```
(K-8)')
('0033600000BZ63EAAT', None, '00636000005ecshAAA', None, None, None, None, 'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies (K-8)')
('0033600000q4AGNAA2', None, '00636000005elT6AAI', None, None, None, None, 'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies (K-8)')
('00336000009lzv6AAA', None, '00636000005elTQAAY', None, None, None, None, 'Western Governors University', 'University', 'B.A. in Interdisciplinary Studies (K-8)')
```

- 1.2 Use your table to pull the following information (provide 1 query per question and your corresponding answer). Please state any of your assumptions. SQL is required
- 1.2.1 Total number of contacts (students) who are not enrolled in any courses.

```
[228]: # Assuming that 'enrolled' means 'at any time' in a course(s).
       students not enrolled = """
       SELECT COUNT(DISTINCT(single table."Sf Contact ID"))
       FROM single_table
       WHERE single_table."Sf Course C ID" IS NULL;
[229]: | query_1 = execute_read_query(connection, students_not_enrolled)
       query_1
[229]: [(18502,)]
[232]: # If it is are not 'currently' enrolled in any courses.
       # students_not_enrolled_alt = """
       # SELECT COUNT(DISTINCT(single_table."Sf Contact ID"))
       # FROM single_table
       # WHERE single table. "Sf Course C Final Grade C" IS NULL
[233]: # query 1 1 = execute read query(connection, students not enrolled alt)
       # query_1_1
[233]: [(18504,)]
```

1.2.2 For each program category count the number of distinct contacts (students) that are enrolled in courses.

```
[222]: program_category_enrollment = """

SELECT single_table."Sf Opportunity Program Category",

→COUNT(DISTINCT(single_table."Sf Contact ID"))
```

```
FROM single_table
       GROUP BY single_table."Sf Opportunity Program Category";
[227]: | query_2 = execute_read_query(connection, program_category_enrollment)
       query_2
[227]: [('Credential', 304),
        ('ELL Program', 183),
        ('Lead Gen - Post Secondary', 541),
        ('Lead Gen - Secondary', 689),
        ('StraighterLine/Saylor', 173),
        ('University', 1765),
        (None, 15151)]
      1.2.3
              Based on your best interpretation of the data, which application type has the
             most number of successful students?
[234]: most successful app = """
       SELECT
           single_table. "Sf Opportunity Application Type C",
           COUNT(DISTINCT(single_table."Sf Contact ID"))
       FROM single_table
       WHERE single_table."Sf Course C Final Grade C"
       IN ('Passed', 'C-', 'C', 'C+', 'B-', 'B', 'B+', 'A-', 'A', 'A+')
       GROUP BY single_table. "Sf Opportunity Application Type C";
       0.00
```

```
[235]: query_3 = execute_read_query(connection, most_successful_app)
query_3
```

Guild Education greatly has the most number of successful students.

1.2.4 What ideas do you have, if any, to better structure the data?

"Sf Course C Final Grade C" could be numerically encoded. This may make it easier to determine metics such as "GPA".

#### 2 Pandas Check

```
[8]: p0 = Path('data\Contact_Details.csv')
      p1 = Path('data\Course_Details.csv')
      p2 = Path('data\Opportunity_Details.csv')
 [9]: df_Contact_Details = pd.read_csv (p0)
      df_Course_Details = pd.read_csv (p1)
      df_Opportunity_Details = pd.read_csv (p2)
[10]: df Contact Details
[10]:
                                   Sf Opportunity ID Sf Course C ID
                  Sf Contact ID
      0
             0033600000q4ADDAA2
                                  00636000005dxASAAY
                                                                 NaN
             0033600000BMcisAAD
                                  00636000005eG7BAAU
      1
                                                                 NaN
      2
             00336000009m01JAAQ
                                  00636000005eGPxAAM
                                                                 NaN
      3
             0033600000B0I13AAH
                                  00636000005eNIpAAM
                                                                 {\tt NaN}
      4
             0033600000BNSXNAA5
                                  00636000005eOcBAAU
                                                                 NaN
      27024 0033600001WRdHtAAL
                                                                 NaN
                                                  NaN
      27025
             0033600001WStcKAAT
                                                                 NaN
                                                  NaN
      27026
             0033600001WUDAMAA5
                                                                 NaN
                                                  NaN
      27027
             0033600001at9GLAAY
                                                  NaN
                                                                 NaN
      27028
             0033600001e029bAAA
                                                  NaN
                                                                 NaN
      [27029 rows x 3 columns]
[70]: df_Contact_Details.describe()
[70]:
                   Sf Contact ID
                                    Sf Opportunity ID
                                                            Sf Course C ID
                            27029
      count
                                                 11878
                                                                       7572
      unique
                            18504
                                                  6968
                                                                       7572
              0033600000VDyNSAA1
                                   00636000001fR5bAAF
                                                        a1C36000007TGoGEAW
      top
      freq
[73]: null_df = pd.DataFrame({'null' : df_Contact_Details.isnull().sum()})
      null_df
[73]:
                           null
      Sf Contact ID
                              0
      Sf Opportunity ID
                          15151
      Sf Course C ID
                          19457
 []:
[11]: df_Course_Details
```

```
[11]:
                Sf Course C ID
                                                        Sf Course C Name \
            a1C36000009t3tGEAQ
                                         High School Completion Program
      0
      1
            a1C36000009eJkMEAU
                                 Management Training Program - 16 Week
      2
            a1C36000009u2k9EAA
                                         High School Completion Program
      3
                                         High School Completion Program
            a1C36000009fIoUEAU
      4
            a1C36000005okzZEAQ
                                 Management Training Program - 16 Week
      7567
            a1C36000005omBXEAY
                                                Organizational Behavior
            a1C36000005omCfEAI
                                               Introduction to Research
      7568
      7569
            a1C36000005omBsEAI
                                           Developing Management Skills
      7570
            a1C36000005omC1EAI
                                           Business Information Systems
      7571 a1C36000005omC6EAI
                                               Essentials of Management
           Sf Course C Course Start Date C Date Sf Course C Course End Date C Date
      0
                                              NaN
                                                                                   NaN
      1
                                              NaN
                                                                                   NaN
      2
                                              NaN
                                                                                   NaN
      3
                                              NaN
                                                                                   NaN
      4
                                              NaN
                                                                                   NaN
                                       11/19/2001
      7567
                                                                             1/13/2002
      7568
                                       11/19/2001
                                                                             1/13/2002
      7569
                                        8/27/2001
                                                                            11/18/2001
      7570
                                        8/27/2001
                                                                            11/18/2001
      7571
                                        8/27/2001
                                                                            11/18/2001
           Sf Course C Final Grade C
      0
                                  NaN
      1
                                  NaN
      2
                                  NaN
      3
                                  NaN
      4
                                  NaN
      7567
                                    Α
      7568
                                    Α
      7569
                                    Α
      7570
                                    Α
      7571
                                    Α
      [7572 rows x 5 columns]
     df_Course_Details.describe()
[74]:
                  Sf Course C ID
                                                  Sf Course C Name
      count
                             7572
                                                               7572
                             7572
                                                                879
      unique
```

High School Completion Program

top

a1C36000007TGoGEAW

```
freq
                               1
                                                              528
             Sf Course C Course Start Date C Date \
                                              7563
      count
      unique
                                               417
      top
                                        3/12/2018
      freq
                                               523
             Sf Course C Course End Date C Date Sf Course C Final Grade C
                                            7539
                                                                      2736
      count
                                             519
      unique
                                                                        24
      top
                                       5/6/2018
                                                                         Α
      freq
                                             311
                                                                       664
[75]: null_df = pd.DataFrame({'null' : df_Course_Details.isnull().sum()})
      null df
[75]:
                                             null
      Sf Course C ID
                                                0
      Sf Course C Name
                                                0
      Sf Course C Course Start Date C Date
                                                9
      Sf Course C Course End Date C Date
                                               33
      Sf Course C Final Grade C
                                             4836
[12]: df_Opportunity_Details
[12]:
             Sf Opportunity ID Sf Opportunity Application Type C
            00636000005dxASAAY
      0
                                                  Guild Education
      1
            00636000005eG7BAAU
                                    Western Governors University
      2
            00636000005eGPxAAM
                                    Western Governors University
      3
            00636000005eNIpAAM
                                    Western Governors University
      4
            00636000005eOcBAAU
                                    Western Governors University
      6963 0063600000f8ny7AAA
                                                  Guild Education
      6964 0063600000f8nz0AAA
                                         Penn Foster High School
                                         Penn Foster High School
      6965 0063600000f8o0oAAA
      6966 0063600000f8o5EAAQ
                                          Penn Foster High School
                                                 Ashworth College
      6967 0063600000f8o5sAAA
           Sf Opportunity Program Category
                                                            Sf Opportunity Program C
      0
                 Lead Gen - Post Secondary
                                                       Giving and Receiving Feedback
      1
                                University B.A. in Interdisciplinary Studies (K-8)
      2
                                University B.A. in Interdisciplinary Studies (K-8)
      3
                                University B.A. in Interdisciplinary Studies (K-8)
                                University B.A. in Interdisciplinary Studies (K-8)
      4
                 Lead Gen - Post Secondary
                                                      High School Completion Program
      6963
```

```
6964
                      Lead Gen - Secondary
                                                           Walmart High School Track
                                                           Walmart High School Track
      6965
                      Lead Gen - Secondary
      6966
                      Lead Gen - Secondary
                                                           Walmart High School Track
      6967
                                University
                                                 Electrician Training Career Diploma
      [6968 rows x 4 columns]
[76]: df_Opportunity_Details.describe()
[76]:
               Sf Opportunity ID Sf Opportunity Application Type C \
      count
                            6968
                                                               6965
      unique
                            6968
                                                                 13
      top
              0063600000WAdvyAAD
                                                    Guild Education
      freq
                                                               2527
             Sf Opportunity Program Category
                                                Sf Opportunity Program C
      count
                                         6968
                                                                    6965
      unique
                                                                     292
                                  University Walmart High School Track
      top
                                         2859
      freq
                                                                     719
[77]: null_df = pd.DataFrame({'null' : df_Opportunity_Details.isnull().sum()})
      null df
[77]:
                                          null
      Sf Opportunity ID
                                             0
      Sf Opportunity Application Type C
                                             3
      Sf Opportunity Program Category
                                             0
      Sf Opportunity Program C
                                             3
[79]: df_Contact_Details.columns.to_list()
[79]: ['Sf Contact ID', 'Sf Opportunity ID', 'Sf Course C ID']
[80]: df_Course_Details.columns.to_list()
[80]: ['Sf Course C ID',
       'Sf Course C Name',
       'Sf Course C Course Start Date C Date',
       'Sf Course C Course End Date C Date',
       'Sf Course C Final Grade C'l
[81]: df_Opportunity_Details.columns.to_list()
[81]: ['Sf Opportunity ID',
       'Sf Opportunity Application Type C',
       'Sf Opportunity Program Category',
       'Sf Opportunity Program C']
```

```
[92]: single_table = df_Contact_Details.merge(df_Course_Details, how='outer', on='Sf_U
       → Course C ID').merge(df_Opportunity_Details, how='outer', on='Sf Opportunity_
       →ID')
[93]:
      single_table
[93]:
                  Sf Contact ID
                                   Sf Opportunity ID
                                                           Sf Course C ID
      0
             0033600000q4ADDAA2
                                  00636000005dxASAAY
                                                                       NaN
             0033600000BMcisAAD
      1
                                  00636000005eG7BAAU
                                                                       NaN
      2
             00336000009m01JAAQ
                                  00636000005eGPxAAM
                                                                       NaN
      3
             0033600000B0I13AAH
                                  00636000005eNIpAAM
                                                                       NaN
      4
             0033600000BNSXNAA5
                                  00636000005eOcBAAU
                                                                       NaN
             0033600001ewXqeAAE
      27024
                                  0063600000f8ikCAAQ
                                                       a1C36000009uvGuEAI
      27025
             0033600001ewjc9AAA
                                  0063600000f8ikHAAQ
                                                       a1C36000009uvH4EAI
             0033600001ewXjyAAE
      27026
                                  0063600000f8ikMAAQ
                                                       a1C36000009uvH9EAI
      27027
             0033600001ex5HkAAI
                                  0063600000f8mvIAAQ
                                                       a1C36000009v8XmEAI
      27028
             0033600001exBCHAA2
                                  0063600000f8ny7AAA
                                                       a1C36000009vD3SEAU
                                 Sf Course C Name
      0
                                               NaN
      1
                                               NaN
      2
                                               NaN
      3
                                               NaN
      4
                                               NaN
      27024
                                        Spanish I
      27025
                                        Spanish I
      27026
             Information Technology Fundamentals
      27027
                                      Precalculus
      27028
                  High School Completion Program
            Sf Course C Course Start Date C Date Sf Course C Course End Date C Date
      0
                                               NaN
                                                                                    NaN
      1
                                               NaN
                                                                                    NaN
      2
                                               NaN
                                                                                    NaN
      3
                                               NaN
                                                                                    NaN
      4
                                               NaN
                                                                                    NaN
      27024
                                          5/1/2018
                                                                              9/1/2018
      27025
                                        5/30/2018
                                                                             9/30/2018
      27026
                                         5/30/2018
                                                                             9/30/2018
      27027
                                         5/30/2018
                                                                             9/30/2018
      27028
                                               NaN
                                                                                    NaN
            Sf Course C Final Grade C Sf Opportunity Application Type C
                                                          Guild Education
      0
                                   NaN
```

```
Western Governors University
      2
                                   NaN
                                            Western Governors University
      3
                                   NaN
                                            Western Governors University
      4
                                   NaN
                                            Western Governors University
      27024
                                   NaN
                                                           StraighterLine
      27025
                                   NaN
                                                           StraighterLine
      27026
                                   NaN
                                                           StraighterLine
      27027
                                                           StraighterLine
                                   NaN
      27028
                                                          Guild Education
                                   NaN
            Sf Opportunity Program Category
                                                              Sf Opportunity Program C
      0
                  Lead Gen - Post Secondary
                                                         Giving and Receiving Feedback
      1
                                  University B.A. in Interdisciplinary Studies (K-8)
      2
                                              B.A. in Interdisciplinary Studies (K-8)
                                  University
      3
                                  University
                                              B.A. in Interdisciplinary Studies (K-8)
      4
                                  University B.A. in Interdisciplinary Studies (K-8)
      27024
                      StraighterLine/Saylor
                                                                              Spanish I
      27025
                      StraighterLine/Saylor
                                                                              Spanish I
      27026
                      StraighterLine/Saylor
                                                   Information Technology Fundamentals
      27027
                      StraighterLine/Saylor
                                                                            Precalculus
      27028
                  Lead Gen - Post Secondary
                                                       High School Completion Program
      [27029 rows x 10 columns]
[94]: single_table.describe()
[94]:
                   Sf Contact ID
                                    Sf Opportunity ID
                                                            Sf Course C ID
                            27029
                                                11878
      count
                                                                      7572
                            18504
                                                                      7572
      unique
                                                  6968
              0033600000VDyNSAA1
                                   00636000001fR5bAAF
                                                        a1C36000007TGoGEAW
      top
      freq
                                                    43
                             Sf Course C Name Sf Course C Course Start Date C Date
      count
                                         7572
                                                                                7563
      unique
                                          879
                                                                                 417
                                                                           3/12/2018
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       freq
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       count
                                           292
       unique
               High School Completion Program
       top
       freq
[103]: single_table.dtypes
[103]: Sf Contact ID
                                                object
       Sf Opportunity ID
                                                object
       Sf Course C ID
                                                object
       Sf Course C Name
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       Sf Course C Course Start Date C Date
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       Sf Course C Course End Date C Date
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       Sf Course C Final Grade C
                                                object
       Sf Opportunity Application Type C
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       Sf Opportunity Program Category
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       Sf Opportunity Program C
                                                object
       dtype: object
[97]: df_Contact_Details.describe()
                                     Sf Opportunity ID
[97]:
                    Sf Contact ID
                                                             Sf Course C ID
       count
                             27029
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       unique
               0033600000VDyNSAA1
                                    0063600000IfR5bAAF
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       freq
                                                    43
[98]: df_Course_Details.describe()
[98]:
                   Sf Course C ID
                                                  Sf Course C Name \
                                                               7572
       count
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                             7572
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       freq
              Sf Course C Course Start Date C Date \
       count
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       unique
                                                417
                                          3/12/2018
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       freq
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Sf Course C Course End Date C Date Sf Course C Final Grade C
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      count
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[99]: single table.describe()
[99]:
                   Sf Contact ID
                                                            Sf Course C ID \
                                    Sf Opportunity ID
                            27029
                                                11878
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      count
      unique
                            18504
                                                  6968
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      top
              0033600000VDyNSAA1
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      freq
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                    Sf Opportunity Program C
      count
                                        11875
                                          292
      unique
      top
              High School Completion Program
      freq
                                          894
[96]: null_df = pd.DataFrame({'null' : single_table.isnull().sum()})
      null_df
[96]:
                                              null
      Sf Contact ID
                                                 0
      Sf Opportunity ID
                                             15151
      Sf Course C ID
                                             19457
      Sf Course C Name
                                             19457
      Sf Course C Course Start Date C Date
```

```
Sf Course C Course End Date C Date
                                              19490
       Sf Course C Final Grade C
                                              24293
       Sf Opportunity Application Type C
                                              15154
       Sf Opportunity Program Category
                                              15151
       Sf Opportunity Program C
                                              15154
[100]: null_df = pd.DataFrame({'null' : df_Contact_Details.isnull().sum()})
       null_df
Γ100]:
                           null
       Sf Contact ID
       Sf Opportunity ID
                          15151
       Sf Course C ID
                          19457
[101]: null_df = pd.DataFrame({'null' : df_Course_Details.isnull().sum()})
       null_df
「101]:
                                              null
       Sf Course C ID
                                                 0
       Sf Course C Name
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       Sf Course C Course Start Date C Date
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       Sf Course C Course End Date C Date
                                                33
       Sf Course C Final Grade C
                                              4836
[102]: null_df = pd.DataFrame({'null' : single_table.isnull().sum()})
       null df
[102]:
                                               null
       Sf Contact ID
                                                  0
       Sf Opportunity ID
                                              15151
       Sf Course C ID
                                              19457
       Sf Course C Name
                                              19457
       Sf Course C Course Start Date C Date
                                              19466
       Sf Course C Course End Date C Date
                                              19490
       Sf Course C Final Grade C
                                              24293
       Sf Opportunity Application Type C
                                              15154
       Sf Opportunity Program Category
                                              15151
       Sf Opportunity Program C
                                              15154
      Export Single Table to CSV File
[110]: single_table_path = Path('data\single_table.csv')
[111]: single_table.to_csv(single_table_path)
```

# 3 Appendix

See  $SQL_QUIERIES.txt$  for straight SQL used and notes.txt for additional info re analysis.