DSC 680 Project 1

March 19, 2020

```
[1]: import csv
     import pandas as pd
     import numpy as np
     #Import file and display first 5 rows
     fludf = pd.read_csv('C:/Users/Christine/Documents/Bellevue/DSC 680/Project 1/
     →fluprint_export.csv')
     fludf.head()
[1]:
        donor_id study_id gender
                                                 visit_id visit_year
                                                                        visit_day
                                           race
     0
             813
                             Female
                                                     2937
                                                                  2014
                         15
                                     Caucasian
                                                                                0
             813
                                                                  2014
     1
                         15 Female
                                     Caucasian
                                                     2937
     2
             813
                         15 Female Caucasian
                                                     2937
                                                                  2014
                                                                                0
     3
             813
                         15 Female Caucasian
                                                     2937
                                                                  2014
                                                                                0
     4
             813
                         15 Female Caucasian
                                                                  2014
                                                                                0
                                                     2937
       visit_type_hai
                       visit_age cmv_status ... vaccinated_2yr_prior
                             23.0
                                           0.0 ...
     0
                                                                     1.0
                  pre
                             23.0
                                           0.0 ...
                                                                     1.0
     1
                  pre
     2
                             23.0
                                           0.0 ...
                                                                     1.0
                  pre
                                           0.0 ...
     3
                             23.0
                                                                     1.0
                  pre
     4
                  pre
                             23.0
                                           0.0 ...
                                                                     1.0
                                vaccinated_3yr_prior
                                                       vaccine_type_3yr_prior
        vaccine_type_2yr_prior
     0
                            2.0
                                                                            2.0
                                                   1.0
                            2.0
                                                   1.0
                                                                            2.0
     1
     2
                            2.0
                                                   1.0
                                                                            2.0
     3
                            2.0
                                                   1.0
                                                                            2.0
     4
                            2.0
                                                   1.0
                                                                            2.0
        vaccinated_4yr_prior vaccine_type_4yr_prior vaccinated_5yr_prior \
     0
                          1.0
                                                   2.0
                                                                          1.0
                          1.0
                                                   2.0
                                                                          1.0
     1
     2
                          1.0
                                                   2.0
                                                                          1.0
     3
                          1.0
                                                   2.0
                                                                          1.0
     4
                          1.0
                                                   2.0
                                                                          1.0
```

```
vaccine_type_5yr_prior influenza_infection_history
     0
                                                             0
                                                             0
     1
                            2.0
     2
                                                             0
                             2.0
     3
                            2.0
                                                             0
     4
                            2.0
                                                             0
       influenza_hospitalization
     0
                                 0
     1
                                 0
     2
                                 0
     3
                                 0
     4
                                 0
     [5 rows x 38 columns]
[2]: #Display statistics for numerical variables
     fludf.describe()
[2]:
                  donor id
                                  study_id
                                                  visit_id
                                                                visit_year
            156118.000000
                             156118.000000
                                             156118.000000
                                                             156118.000000
     count
                                                                2011.774241
     mean
                392.616181
                                 19.359709
                                                896.606452
     std
                190.507183
                                  3.234831
                                                679.654527
                                                                   1.761023
     min
                  1.000000
                                 15.000000
                                                  1.000000
                                                                2007.000000
     25%
                240.000000
                                 18.000000
                                                396.000000
                                                               2011.000000
     50%
                402.000000
                                 18.000000
                                                871.000000
                                                                2013.000000
     75%
                                               1148.000000
                501.000000
                                 21.000000
                                                                2013.000000
                813.000000
                                 30.000000
                                               2937.000000
                                                                2015.000000
     max
                                                               ebv_status
                 visit_day
                                 visit_age
                                                cmv_status
            156118.000000
                             156118.000000
                                             107540.000000
                                                             83087.000000
     count
     mean
                  0.063426
                                 20.107988
                                                  0.360545
                                                                  0.388280
     std
                  0.317120
                                 17.974787
                                                  0.480161
                                                                  0.487362
     min
                  0.00000
                                  0.580000
                                                  0.000000
                                                                  0.00000
     25%
                  0.000000
                                  7.280000
                                                  0.000000
                                                                  0.000000
     50%
                  0.000000
                                 17.420000
                                                  0.000000
                                                                  0.000000
     75%
                                 25.030000
                  0.000000
                                                  1.000000
                                                                  1.000000
                  7.000000
                                 90.000000
                                                  1.000000
                                                                  1.000000
     max
                                               vaccinated_2yr_prior
                      bmi
                                  vaccine
            61708.000000
                            103295.000000
                                                        53273.000000
     count
     mean
                24.399225
                                 3.419807
                                                            0.656806
     std
                                 1.218462
                                                            0.879408
                 5.432518
     min
                13.120000
                                 1.000000
                                                            0.000000
     25%
                20.810000
                                 3.000000
                                                            0.000000
     50%
                23.540000
```

0.000000

1.000000

4.000000

4.000000

75%

27.300000

52.120000 6.000000 ... 3.000000 maxvaccine_type_2yr_prior vaccinated_3yr_prior vaccine_type_3yr_prior 43979.000000 21706.000000 15855.000000 count 2.642284 0.901640 2.299401 mean std 0.575715 0.856187 0.533698 min 2.000000 2.000000 0.000000 25% 2.000000 0.00000 2.000000 50% 1.000000 2.000000 3.000000 75% 3.000000 1.000000 3.000000 4.000000 max 3.000000 4.000000 vaccinated_4yr_prior vaccine_type_4yr_prior vaccinated_5yr_prior count 21706.000000 15778.000000 8659.000000 0.987653 2.348397 0.965008 mean std 0.946111 0.544284 0.951613 min 0.000000 2.000000 0.00000 25% 0.000000 2.000000 0.000000 50% 1.000000 2.000000 1.000000 75% 1.000000 3.000000 1.000000 3.000000 4.000000 3.000000 max influenza_infection_history vaccine_type_5yr_prior 8254.000000 156118.000000 count 2.276957 0.049860 mean std 0.576707 0.217656 min 2.000000 0.000000 25% 2.000000 0.000000 50% 2.000000 0.000000 75% 2.000000 0.000000 4.000000 1.000000 maxinfluenza_hospitalization 156118.000000 count 0.004445 mean std 0.066525 min 0.000000 25% 0.000000 50% 0.000000 75% 0.000000 1.000000 max[8 rows x 31 columns]

3

[3]: # Search for missing values print(fludf.isnull().sum())

```
donor_id
                                          0
                                          0
    study_id
    gender
                                          0
                                        582
    race
    visit id
                                          0
    visit_year
                                          0
    visit_day
                                          0
    visit_type_hai
                                          0
                                          0
    visit_age
                                      48578
    cmv_status
                                      73031
    ebv_status
                                     94410
    bmi
                                     52823
    vaccine
    geo_mean
                                          0
                                     40806
    d_geo_mean
                                      43662
    vaccine_response
    mesurment_id
                                          0
                                          0
    assay
                                          0
    name
    name formatted
                                          0
    subset
                                          0
    units
                                          0
    data
                                          0
    statin_use
                                       2550
    flu_vaccination_history
                                    122588
    total_vaccines_received
                                    121888
    vaccinated_1yr_prior
                                       1182
    vaccine_type_1yr_prior
                                     24234
    vaccinated_2yr_prior
                                    102845
    vaccine_type_2yr_prior
                                    112139
    vaccinated_3yr_prior
                                    134412
    vaccine_type_3yr_prior
                                    140263
    vaccinated_4yr_prior
                                    134412
    vaccine_type_4yr_prior
                                    140340
    vaccinated 5yr prior
                                    147459
    vaccine_type_5yr_prior
                                    147864
    influenza_infection_history
                                          0
    influenza_hospitalization
                                          0
    dtype: int64
[4]: # Get column names
     column_names = fludf.columns
     print(column_names)
     # Get column data types
     print(fludf.dtypes)
```

```
'bmi', 'vaccine', 'geo_mean', 'd_geo_mean', 'vaccine_response',
       'mesurment_id', 'assay', 'name', 'name_formatted', 'subset', 'units',
       'data', 'statin_use', 'flu_vaccination_history',
       'total_vaccines_received', 'vaccinated_1yr_prior',
       'vaccine_type_1yr_prior', 'vaccinated_2yr_prior',
       'vaccine_type_2yr_prior', 'vaccinated_3yr_prior',
       'vaccine_type_3yr_prior', 'vaccinated_4yr_prior',
       'vaccine_type_4yr_prior', 'vaccinated_5yr_prior',
       'vaccine_type_5yr_prior', 'influenza_infection_history',
       'influenza_hospitalization'],
      dtype='object')
donor_id
                                  int64
                                  int64
study_id
gender
                                 object
race
                                 object
                                  int64
visit_id
visit_year
                                  int64
visit_day
                                  int64
                                 object
visit_type_hai
visit age
                                float64
cmv status
                                float64
                                float64
ebv status
bmi
                                float64
vaccine
                                float64
geo_mean
                                float64
                                float64
d_geo_mean
                                float64
vaccine_response
mesurment_id
                                  int64
                                  int64
assay
                                 object
name
name_formatted
                                 object
subset
                                 object
units
                                 object
data
                                float64
                                float64
statin use
flu vaccination history
                                float64
                                float64
total vaccines received
vaccinated_1yr_prior
                                float64
vaccine_type_1yr_prior
                                float64
vaccinated_2yr_prior
                                float64
vaccine_type_2yr_prior
                                float64
vaccinated_3yr_prior
                                float64
vaccine_type_3yr_prior
                                float64
                                float64
vaccinated_4yr_prior
vaccine_type_4yr_prior
                                float64
vaccinated_5yr_prior
                                float64
vaccine_type_5yr_prior
                                float64
influenza_infection_history
                                  int64
```

influenza_hospitalization int64

LPS_EM CD8+ T cells: pSTAT1

dtype: object

```
[18]: fludf['name'].value_counts()
[18]: L50_FASL
                                          555
     L50_TNFB
                                          525
     L50_MIP1A
                                          525
     L50 MIG
                                          525
      L50_IFNB
                                          525
     L50 MIP1B
                                          525
     L50_LIF
                                          525
     L50_IFNG
                                          525
     L50_IL12P40
                                          525
     L50_LEPTIN
                                          525
     L50_IL15
                                          525
      L50_GCSF
                                          525
     L50_TGFA
                                          525
     L50_IL5
                                          525
     L50_VEGF
                                          525
     L50_IL10
                                          525
     L50_FGFB
                                          525
     L50_GMCSF
                                          525
     L50 SCF
                                          525
     L50_IL1B
                                          525
     L50_IL7
                                          525
     L50_IL1A
                                          525
     L50_VCAM1
                                          525
                                          525
     L50_ICAM1
     L50_IL17
                                          525
                                          525
     L50_TNFA
                                          525
     L50_MCP3
      L50_IL1RA
                                          525
      L50_TGFB
                                          525
     L50_IL17F
                                          525
      IFNa_EM CD8+ T cells: pSTAT3
                                           20
     LPS_EM CD4+ T cells: pErk1_2
                                           20
     LPS_EM CD4+ T cells: pSTAT5
                                           20
      IL-21_EM CD8+ T cells: pSTAT1
                                           19
     LPS_EM CD8+ T cells: pPLCg2
                                           19
      IL-21_EM CD8+ T cells: pSTAT5
                                           19
      LPS_EM CD8+ T cells: pErk1_2
                                           19
      IL-21_EM CD8+ T cells: IkBtot
                                           19
      IL-21_EM CD8+ T cells: pp38
                                           19
      LPS_EM CD8+ T cells: pp38
                                           19
```

19

```
IL-21_EM CD8+ T cells: Ki67
                                     19
IL-21_EM CD8+ T cells: pPLCg2
                                     19
LPS_EM CD8+ T cells: pCREB
                                     19
LPS_EM CD8+ T cells: Ki67
                                     19
LPS_EM CD8+ T cells: IkBtot
                                     19
IL-21_EM CD8+ T cells: pCREB
                                     19
LPS_EM CD8+ T cells: pSTAT5
                                     19
IL-21_EM CD8+ T cells: pErk1_2
                                     19
LPS_EM CD8+ T cells: pSTAT3
                                     19
IL-21_EM CD8+ T cells: pSTAT3
                                     19
Unstim_EM CD8+ T cells: pp38
                                     18
Unstim_EM CD8+ T cells: pPLCg2
                                     18
Unstim_EM CD8+ T cells: pSTAT5
                                     18
Unstim_EM CD8+ T cells: pCREB
                                     18
Unstim_EM CD8+ T cells: IkBtot
                                     18
Unstim_EM CD8+ T cells: pErk1_2
                                     18
Unstim_EM CD8+ T cells: pSTAT1
                                     18
Unstim_EM CD8+ T cells: pSTAT3
                                     18
Unstim_EM CD8+ T cells: Ki67
                                     18
Name: name, Length: 3283, dtype: int64
```

[16]: fludf['subset'].value_counts()

[16]: CD4+: pSTAT3	1288
CD8+: pSTAT1	1288
Mono: pSTAT5	1288
Mono: pSTAT1	1288
CD8+: pSTAT5	1288
B cell: pSTAT1	1288
CD4+: pSTAT1	1288
Mono: pSTAT3	1288
CD4+: pSTAT5	1288
B cell: pSTAT5	1288
CD8+: pSTAT3	1288
B cell: pSTAT3	1288
CD4+CD45RA+: pSTAT1	1050
CD8+CD45RA-: pSTAT3	1050
CD4+CD45RA-: pSTAT3	1050
CD8+CD45RA-: pSTAT5	1050
CD4+CD45RA+: pSTAT3	1050
CD4+CD45RA-: pSTAT1	1050
CD8+CD45RA+: pSTAT1	1050
CD8+CD45RA-: pSTAT1	1050
CD4+CD45RA+: pSTAT5	1050
CD4+CD45RA-: pSTAT5	1050
CD8+CD45RA+: pSTAT5	1050
CD8+CD45RA+: pSTAT3	1050
ODO OD TORATO	1050

```
IL1B
                                                              800
    TNFA
                                                              800
    IL8
                                                              800
    IL6
                                                              800
    IFNG
                                                              734
    IL10
                                                              734
    NK-NKT: Lymph/CD3-/CD16+/CD56+/Q1: CD314-CD94+
                                                               26
    B cell: Lymph/CD3-/CD19+CD20+/Q4: IgD-CD27-
                                                               26
    NK-NKT: Lymph/CD3+/CD8+/Q3: CD314+CD94-
                                                               26
    CXCR3 FMO: Lymph/CD3+/CD4+
                                                               26
    NK-NKT: Lymph/CD3+/CD8-/Q3: CD314+CD94-
                                                               26
    PROGESTERONE
                                                               26
    Treg: Lymph/CD3+/CD4+/CD25hiCD127low
                                                               26
    B cell: Lymph/CD3-/CD19+CD20+/CD24+/CD38-
                                                               26
    Treg: Lymph/CD3+/CD4+/CD25hiCD127low/Q1: CD161-CD45RA+
                                                               26
    NK-NKT: Lymph/CD3+/CD8-
                                                               26
    T cell: Lymph/CD3+/CD4+/Q2: CD45RA+CD27+
                                                               26
    T cell: Lymph/CD3+/CD4+/CD28+
                                                               26
    Treg: Lymph/CD3+/CD8+/CD161+
                                                               26
    CXCR3 FMO: Lymph/CD16+/CD56+
                                                               26
    NK-NKT: Lymph/CD3-/CD16+/CD56+/HLADR+
                                                               26
    Activated T: Lymph/CD3+/CD4+/Q1: HLADR-CD38+
                                                               26
    CXCR3 FMO: Mono
                                                               26
    B cell: Lymph/CD3-/CD19+CD20+
                                                               26
    Treg: Lymph/CD3+/CD8+
                                                               26
    B cell: Lymph/CD3-/CD19+CD20+/Q3: IgD+CD27-
                                                               26
    Activated T: Lymph/CD3+
                                                               26
    Activated T: Lymph/CD3+/CD4+
                                                               26
                                                               26
    NK-NKT: Lymph/CD3+CD56+
    NK-NKT: Lymph/CD3-/CD16+/CD56+
                                                               26
    B cell: Lymph/CD3-
                                                               26
    CXCR3 FMO: Mono/CD33+
                                                               26
    CXCR3: Lymph/CD3+/CD4+/CXCR3+
                                                               26
    T cell: Lymph/CD3+/CD8+/Q4: CD45RA-CD27-
                                                               26
    B cell: Lymph/CD3-/CD20-
                                                               26
    CXCR3: Lymph/CD3-
                                                               26
    Name: subset, Length: 632, dtype: int64
[7]: flusub = fludf[["donor_id", "gender", "race", "visit_id", "visit_year", __
     →"vaccine", "vaccine_response", "influenza_infection_history",
     →"influenza hospitalization"]]
    flusub.head()
[7]:
       donor_id gender
                              race visit_id visit_year visit_day
                                                                  visit_age \
```

2014

0

23.0

2937

0

813 Female Caucasian

```
2937
                                                        2014
                                                                                23.0
     1
             813 Female
                           Caucasian
                                                                       0
     2
             813 Female
                           Caucasian
                                           2937
                                                        2014
                                                                       0
                                                                                23.0
     3
                                                                                23.0
             813
                  Female
                           Caucasian
                                           2937
                                                        2014
                                                                       0
     4
             813 Female
                           Caucasian
                                                        2014
                                                                       0
                                                                                23.0
                                           2937
        cmv_status
                     ebv_status
                                 bmi
                                       statin_use
                                                    vaccine
                                                             vaccine_response \
     0
               0.0
                            0.0
                                 NaN
                                              0.0
                                                        4.0
                                                                           0.0
     1
               0.0
                            0.0
                                 NaN
                                              0.0
                                                        4.0
                                                                           0.0
     2
               0.0
                                              0.0
                                                        4.0
                                                                           0.0
                            0.0
                                 {\tt NaN}
     3
               0.0
                            0.0
                                 NaN
                                              0.0
                                                        4.0
                                                                           0.0
     4
               0.0
                                              0.0
                            0.0
                                 {\tt NaN}
                                                        4.0
                                                                           0.0
        influenza_infection_history
                                       influenza_hospitalization
     0
                                    0
     1
                                    0
                                                                 0
     2
                                    0
                                                                 0
     3
                                    0
                                                                 0
     4
                                    0
                                                                 0
[8]: # Search for missing values
     print(flusub.isnull().sum())
                                         0
    donor_id
    gender
                                         0
                                       582
    race
                                         0
    visit_id
                                         0
    visit_year
                                         0
    visit_day
    visit_age
                                         0
    cmv_status
                                     48578
    ebv_status
                                     73031
    bmi
                                     94410
                                      2550
    statin_use
    vaccine
                                     52823
                                     43662
    vaccine_response
    influenza_infection_history
                                         0
    influenza_hospitalization
                                         0
    dtype: int64
[9]: result_flu = flusub.drop_duplicates()
     result_flu.head()
[9]:
          donor_id gender
                                   race
                                         visit_id visit_year visit_day
                                                                            visit_age \
                    Female
                             Caucasian
                                             2937
                                                          2014
                                                                         0
                                                                                  23.0
                813
                                                          2014
     140
               812
                                             2936
                                                                         0
                                                                                  28.0
                       Male Caucasian
     280
               811
                       Male Caucasian
                                             2935
                                                          2014
                                                                         0
                                                                                  23.0
     420
               810
                       Male Caucasian
                                             2934
                                                          2014
                                                                         0
                                                                                  27.0
```

```
560
                 809
                     Female
                                   Asian
                                               2933
                                                            2014
                                                                            0
                                                                                    27.0
            cmv_status
                         ebv_status
                                     bmi
                                           statin_use
                                                        vaccine
                                                                  vaccine_response
      0
                   0.0
                                     NaN
                                                            4.0
                                0.0
                                                   0.0
      140
                   1.0
                                1.0
                                     NaN
                                                   0.0
                                                            4.0
                                                                                0.0
                                                            4.0
                                                                                0.0
      280
                   0.0
                                0.0
                                     NaN
                                                   0.0
      420
                   1.0
                                1.0
                                     NaN
                                                   0.0
                                                            4.0
                                                                                0.0
      560
                   1.0
                                1.0
                                     NaN
                                                   0.0
                                                            4.0
                                                                                0.0
            influenza_infection_history
                                           influenza_hospitalization
      0
                                        0
      140
                                                                     0
                                        0
      280
                                                                     0
                                        0
      420
                                                                     0
      560
                                        0
                                                                     0
[10]: result_flu.describe()
[10]:
               donor_id
                             visit_id
                                         visit_year
                                                       visit_day
                                                                    visit_age
             740.00000
                           740.000000
                                         740.000000
                                                      740.000000
                                                                   740.000000
      count
              426.57027
                          1026.764865
                                        2010.787838
                                                        0.121622
                                                                    38.354784
      mean
                                                        0.526759
                                                                    25.180895
      std
              227.35277
                           796.029879
                                           2.126478
      min
                1.00000
                             1.000000
                                        2007.000000
                                                        0.00000
                                                                     0.580000
      25%
              233.75000
                           372.250000
                                        2009.000000
                                                        0.000000
                                                                    19.775000
                           941.500000
      50%
              421.50000
                                        2011.000000
                                                        0.000000
                                                                    27.180000
      75%
              628.25000
                          1436.750000
                                        2012.000000
                                                        0.000000
                                                                    61.000000
              813.00000
                          2937.000000
                                        2015.000000
                                                        7.000000
                                                                    90.000000
      max
              cmv_status
                           ebv_status
                                               bmi
                                                     statin_use
                                                                     vaccine
                           180.000000
                                                     690.000000
      count
             311.000000
                                        475.000000
                                                                  619.000000
      mean
                0.411576
                             0.572222
                                         24.984000
                                                       0.115942
                                                                    3.626817
      std
                0.492912
                             0.496137
                                                       0.320388
                                          5.649661
                                                                    1.366967
      min
                0.000000
                             0.000000
                                         13.120000
                                                       0.000000
                                                                    1.000000
      25%
                             0.000000
                                         21.245000
                                                       0.00000
                                                                    4.000000
                0.000000
      50%
                0.000000
                             1.000000
                                         24.050000
                                                       0.000000
                                                                    4.000000
      75%
                1.000000
                             1.000000
                                         28.395000
                                                       0.000000
                                                                    4.000000
                1.000000
                             1.000000
                                         52.120000
                                                       1.000000
                                                                    6.000000
      max
              vaccine_response
                                 influenza_infection_history
                    363.000000
                                                    740.000000
      count
                      0.305785
                                                      0.091892
      mean
      std
                      0.461375
                                                      0.289069
      min
                      0.00000
                                                      0.00000
      25%
                      0.000000
                                                      0.00000
      50%
                      0.000000
                                                      0.00000
      75%
                      1.000000
                                                      0.000000
                      1.000000
                                                      1.000000
      max
```

```
influenza_hospitalization
                             740.000000
      count
                               0.010811
      mean
      std
                               0.103481
      min
                               0.000000
      25%
                               0.000000
      50%
                               0.000000
      75%
                               0.000000
      max
                               1.000000
[11]: # Search for missing values
      print(result_flu.isnull().sum())
                                        0
     donor_id
     gender
                                        0
                                        5
     race
     visit_id
                                        0
     visit_year
                                        0
                                        0
     visit_day
     visit_age
                                        0
     cmv_status
                                      429
     ebv_status
                                      560
     bmi
                                      265
     statin_use
                                       50
                                      121
     vaccine
     vaccine_response
                                      377
     influenza_infection_history
                                        0
     \verb|influenza_hospitalization||
                                        0
     dtype: int64
[12]: result_flu.to_csv(r'C:/Users/Christine/Documents/Bellevue/DSC 680/Project 1/
       →result_flu.csv', header = True, index = False)
 []:
```