ShuffleandSplit2C19-Appendix

February 25, 2015

```
In [56]: import numpy as np
         import pandas as pd
0.0.1 Load dataframe and count number of cases positive and negative cases
In [57]: isozyme2c19 = pd.read_csv('data/2c19.csv')
In [58]: # Renaming the Activity Score column to conform to Python syntax
         isozyme2c19.rename(columns={'p450-cyp2c19-ActivityScore': 'ActivityScore'}, inplace=True)
In [59]: # Number of substances with an activity scores greater than or equal to 40
         n_pos = (isozyme2c19.ActivityScore >= 40).sum()
         n_pos
Out[59]: 5914
In [60]: # Number of substances with an activity score below 40
         n_neg = (isozyme2c19.ActivityScore < 40).sum()</pre>
Out[60]: 11229
     Downsampling the negative cases
This section of code shuffles the order of substances with an Activity Score below 40 (negatives). Then
The seed value is set for the randomizer to ensure reproducibility. Different seeds will result in diff
In [61]: # method adapted from DataRobot post about scikit-learn classification
         # Downsample negative cases -- there are many more negatives than positives
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```
# Downsample negative cases -- there are many more negatives than positives

indices = np.where(isozyme2c19.ActivityScore < 40)[0]

rng = np.random.RandomState(50) # sets seed for random number generator

rng.shuffle(indices) # different seed numbers result in different shuffle
n_pos = (isozyme2c19.ActivityScore >= 40).sum()

balanced = isozyme2c19.drop(isozyme2c19.index[indices[n_pos:]])

balanced.head(10)
```

| Out[61]: | | SID | ActivityScore | apol | a_acc | a_acid | a_aro | a_base | $a_count \setminus$ | \ |
|----------|---|--------|---------------|-----------|----------|-----------|----------|-----------|----------------------|---|
| | 0 | 842238 | 0 | 51.111824 | 1 | 0 | 6 | 1 | 46 | |
| | 2 | 842319 | 20 | 52.328274 | 4 | 0 | 6 | 0 | 42 | |
| | 3 | 842408 | 90 | 42.691135 | 4 | 0 | 11 | 0 | 31 | |
| | 4 | 842584 | 41 | 36.787930 | 3 | 0 | 17 | 0 | 28 | |
| | 5 | 842618 | 85 | 70.986168 | 5 | 0 | 17 | 2 | 64 | |

```
8
             842891
                                  0
                                     81.870926
                                                      6
                                                              0
                                                                    11
                                                                              2
                                                                                      75
             842953
                                                      3
         9
                                 44
                                     62.660240
                                                              0
                                                                    12
                                                                              1
                                                                                      52
         10 842968
                                                      3
                                                                    12
                                                                                      52
                                 10
                                     61.196651
                                                              4
                                                                              0
         11 843048
                                 43
                                     57.944275
                                                     7
                                                              0
                                                                    23
                                                                              0
                                                                                      47
                                                                          vsa_hyd \
             a_don
                    a_heavy
                                        vsa_acid vsa_base
                                                               vsa_don
                               . . .
         0
                                                               5.682576
                                                                         286.85770
                  1
                          21
                                         0.000000
                                                           0
         2
                  0
                          24
                                         0.000000
                                                           0
                                                               0.000000
                                                                          241.82869
                               . . .
         3
                 0
                          22
                                                           0
                                                               0.000000
                                         0.000000
                                                                         191.26006
         4
                  2
                          18
                                         0.000000
                                                               0.000000
                                                                          180.79523
                                . . .
         5
                 0
                          31
                                         0.000000
                                                           0
                                                               0.000000
                                                                          380.40643
                                . . .
         6
                 1
                          24
                                         0.000000
                                                           0
                                                               5.682576
                                                                          224.58302
                                . . .
         8
                  1
                                         0.000000
                                                           0
                                                               5.682576
                                                                          385.93207
                          36
                               . . .
         9
                  1
                          29
                                         0.000000
                                                           0
                                                               0.000000
                                                                          340.08496
                                . . .
         10
                  0
                          31
                                        54.267685
                                                           0
                                                               0.000000
                                                                          279.94351
                               . . .
         11
                  4
                          29
                                         0.000000
                                                              23.425066
                                                                         232.84666
                               . . .
             vsa\_other
                           vsa_pol
                                       Weight weinerPath weinerPol zagreb
         0
             12.949531 19.249496
                                    310.84900
                                                      1050
                                                                    30
                                                                            102
         2
             36.550735
                         61.022110 362.47400
                                                       1295
                                                                    41
                                                                            126
         3
             42.243458
                         59.150364 355.41501
                                                        983
                                                                    35
                                                                            120
         4
             22.381124
                         24.524654
                                    255.70799
                                                        624
                                                                    25
                                                                            94
         5
             11.190562
                         43.926376 423.56500
                                                      2659
                                                                    49
                                                                            164
         6
             25.239683
                                                                    32
                                                                            120
                         59.437412 324.34399
                                                      1583
         8
             24.140093
                         59.997055 497.64398
                                                      4018
                                                                    54
                                                                            190
         9
             24.140093
                         33.813168
                                   434.34698
                                                      2338
                                                                    47
                                                                            154
         10 44.575069
                         72.842117
                                                                    51
                                                                            158
                                    423.42099
                                                       2656
             66.910896
                         67.501205
                                    406.47400
                                                      2687
                                                                    40
                                                                            150
         [10 rows x 188 columns]
In [62]: # Demonstrate the dataset is balanced
         n_pos = (balanced.ActivityScore >= 40).sum()
         n_neg = (balanced.ActivityScore < 40).sum()</pre>
         n_neg, n_pos
Out[62]: (5914, 5914)
In [63]: # Repeat code with different seed number to demonstrate shuffling
         indices2 = np.where(isozyme2c19.ActivityScore < 40)[0]</pre>
         rng2 = np.random.RandomState(3489453655) # sets seed for random number generator
                                              # different seed numbers result in different shuffle
         rng2.shuffle(indices2)
         n_pos2 = (isozyme2c19.ActivityScore >= 40).sum()
         balanced2 = isozyme2c19.drop(isozyme2c19.index[indices2[n_pos2:]])
         balanced2.head(10)
Out[63]:
                      ActivityScore
                 SID
                                           apol
                                                 a_acc
                                                        a\_acid
                                                                a_aro
                                                                        a_base
                                                                                a_count
                                                                                      31
         3
             842408
                                     42.691135
                                                      4
                                                              0
                                                                    11
                                                                              0
                                 90
             842584
         4
                                 41
                                     36.787930
                                                      3
                                                              0
                                                                    17
                                                                              0
                                                                                      28
         5
             842618
                                 85
                                     70.986168
                                                      5
                                                              0
                                                                    17
                                                                              2
                                                                                      64
         6
             842697
                                 42 47.032688
                                                      6
                                                              0
                                                                    17
                                                                              0
                                                                                      40
         7
             842789
                                  0 59.769032
                                                     3
                                                              0
                                                                    12
                                                                              0
                                                                                      52
```

42 47.032688

0

17

40

6

842697

| 8 | 842891 | | 0 | 81.870926 | 3 | 6 | | 0 : | 11 | 2 | 75 |
|----|--------------------|-------|-------|-----------|-----|----------|-----|----------|-----|-----------------------------|----|
| 9 | 842953 | | 44 | 62.660240 |) | 3 | | 0 : | 12 | 1 | 52 |
| 10 | 842968 | | 10 | 61.196651 | 1 | 3 | | 4 | 12 | 0 | 52 |
| 11 | 843048 | | 43 | 57.944275 | 5 | 7 | | 0 2 | 23 | 0 | 47 |
| 12 | 843170 | | 20 | 56.986618 | 3 | 4 | | 0 | 6 | 0 | 52 |
| | | | | | | | | | | | |
| | a_don a_he | eavy | | vsa_ac: | id | vsa_base | Э | vsa_dc | n | ${\tt vsa_hyd} \setminus$ | |
| 3 | 0 | 22 | | 0.0000 | 000 | | 0 | 0.0000 | 000 | 191.26006 | |
| 4 | 2 | 18 | | 0.0000 | 000 | | 0 | 0.0000 | 000 | 180.79523 | |
| 5 | 0 | 31 | | 0.0000 | 000 | | 0 | 0.0000 | 000 | 380.40643 | |
| 6 | 1 | 24 | | 0.0000 | 000 | | 0 | 5.682 | 576 | 224.58302 | |
| 7 | 3 | 28 | | 0.0000 | 000 | | 0 | 17.047 | 728 | 266.20810 | |
| 8 | 1 | 36 | | 0.0000 | 000 | | 0 | 5.682 | 576 | 385.93207 | |
| 9 | 1 | 29 | | 0.0000 | 000 | | 0 | 0.0000 | 000 | 340.08496 | |
| 10 | 0 | 31 | | 54.2676 | 385 | | 0 | 0.0000 | 000 | 279.94351 | |
| 11 | 4 | 29 | | 0.0000 | 000 | | 0 | 23.4250 | 066 | 232.84666 | |
| 12 | 1 | 26 | | 0.0000 | 000 | | 0 | 5.682 | 576 | 283.60077 | |
| | | | | | | | | | | | |
| | ${\tt vsa_other}$ | vsa | _pol | Weight | wei | inerPath | . 1 | weinerPo | 1 | zagreb | |
| 3 | 42.243458 | 59.15 | 50364 | 355.41501 | | 983 | 3 | ; | 35 | 120 | |
| 4 | 22.381124 | 24.52 | 24654 | 255.70799 | | 624 | 1 | | 25 | 94 | |
| 5 | 11.190562 | 43.92 | 26376 | 423.56500 | | 2659 | 9 | 4 | 19 | 164 | |
| 6 | 25.239683 | 59.43 | 37412 | 324.34399 | | 1583 | 3 | ; | 32 | 120 | |
| 7 | 43.339603 | 57.74 | 18489 | 380.44800 | | 2253 | 3 | 4 | 10 | 142 | |
| 8 | 24.140093 | 59.99 | 97055 | 497.64398 | | 4018 | 3 | į | 54 | 190 | |
| 9 | 24.140093 | 33.81 | L3168 | 434.34698 | | 2338 | 3 | 4 | 17 | 154 | |
| 10 | 44.575069 | 72.84 | 12117 | 423.42099 | | 2656 | 3 | į | 51 | 158 | |
| 11 | 66.910896 | 67.50 | 1205 | 406.47400 | | 2687 | 7 | 4 | 10 | 150 | |
| 12 | 43.111317 | 48.88 | 37096 | 362.42599 | | 1631 | 1 | 4 | 14 | 136 | |
| | | | | | | | | | | | |

[10 rows x 188 columns]

0.2 Write files for analysis

In [64]: balanced.to_csv("data/balanced2c19.csv", index=False)

0.3 Generate Training and Test Set

In [65]: twoC19 = pd.read_csv("data/balanced2c19.csv")

| In [66]: | tw | oC19.hea | ad() | | | | | | | | |
|----------|----|----------|---------|--------|-----------|--------|------|-----|-------|---------|-----------|
| Out[66]: | | SID | Activit | yScore | apol | a_acc | a_ac | id | a_aro | a_base | a_count \ |
| | 0 | 842238 | | 0 | 51.111824 | 1 | | 0 | 6 | 1 | 46 |
| | 1 | 842319 | | 20 | 52.328274 | 4 | | 0 | 6 | 0 | 42 |
| | 2 | 842408 | | 90 | 42.691135 | 4 | | 0 | 11 | 0 | 31 |
| | 3 | 842584 | | 41 | 36.787930 | 3 | | 0 | 17 | 0 | 28 |
| | 4 | 842618 | | 85 | 70.986168 | 5 | | 0 | 17 | 2 | 64 |
| | | a_don | a_heavy | | vsa_acid | vsa_ba | se | vsa | _don | vsa_hyd | \ |
| | 0 | 1 | 21 | | 0 | | 0 | 5.6 | 82576 | 286.857 | 70 |
| | 1 | 0 | 24 | | 0 | | 0 | 0.0 | 00000 | 241.828 | 69 |
| | 2 | 0 | 22 | | 0 | | 0 | 0.0 | 00000 | 191.260 | 06 |
| | 3 | 2 | 18 | | 0 | | 0 | 0.0 | 00000 | 180.795 | 23 |
| | 4 | 0 | 31 | | 0 | | 0 | 0.0 | 00000 | 380.406 | 43 |

```
Weight weinerPath weinerPol zagreb
  vsa_other
               vsa_pol
                       310.84900
 12.949531
            19.249496
                                         1050
                                                      30
                                                             102
                        362.47400
                                         1295
                                                      41
                                                             126
1 36.550735 61.022110
2 42.243458 59.150364
                        355.41501
                                          983
                                                      35
                                                             120
3 22.381124 24.524654
                                          624
                                                      25
                                                              94
                        255.70799
 11.190562 43.926376 423.56500
                                         2659
                                                      49
                                                             164
```

[5 rows x 188 columns]

0.3.1 Shuffle and split dataset while preserving pandas index and metadata.

```
In [67]: # Method adapted to Python3 from function by boates at https://qist.github.com/boates/5127281
         N = len(twoC19)
In [68]: 1 = list(range(N))
In [69]: random.seed(76)
         random.shuffle(1)
In [70]: # get splitting indicies
         # Here they are set to 80% training, 0% cross-validation and 20% test sets
         trainLen = int(N*.8)
                  = int(N*0.0)
         cvLen
         testLen = int(N*.2)
In [71]: # get training, cv, and test sets
         training = twoC19.ix[l[:trainLen]]
                  = twoC19.ix[l[trainLen:trainLen+cvLen]]
                  = twoC19.ix[l[trainLen+cvLen:]]
         test
In [72]: # Examine training set
         training.head()
Out [72]:
                      SID ActivityScore
                                                                            a\_base
                                                apol
                                                      a_acc
                                                             a\_acid
                                                                     a_aro
         3232
                 4251837
                                           58.610653
                                                          5
                                                                   0
                                                                         17
                                                                                   0
         5553
                11112737
                                      43 57.457447
                                                          4
                                                                   0
                                                                         12
                                                                                   1
         2512
                 4242934
                                      84 50.423859
                                                          4
                                                                   0
                                                                         11
                                                                                   0
                                      20 37.776344
                                                                   0
                                                                         11
                                                                                   0
         10128 17410368
                                                          3
         7432
                                       0 46.399101
                                                                         17
                14741505
                                                                   0
                                                                                   0
                a_count a_don a_heavy
                                                   vsa_acid vsa_base
                                                                          vsa_don
                                           . . .
         3232
                      49
                              1
                                      28
                                                           0
                                                                      0
                                                                          5.682576
                                            . . .
         5553
                      49
                              0
                                      27
                                                           0
                                                                      0
                                                                          0.000000
                                            . . .
                              2
                                                                         11.365152
         2512
                                      24
                                                                      0
                      44
                                                           0
                                            . . .
         10128
                      28
                              1
                                      20
                                                           0
                                                                      0
                                                                          5.682576
                                            . . .
                                                                          5.682576
         7432
                      37
                              1
                                      23
                                                           0
                                            . . .
                  vsa_hyd
                           {\tt vsa\_other}
                                         vsa_pol
                                                     Weight
                                                             weinerPath weinerPol
         3232
                334.55359
                            26.116156 32.443340
                                                   399.47101
                                                                     2372
                                                                                   41
         5553
                295.90125
                            41.257984 21.078190
                                                   389.85898
                                                                     2275
                                                                                   38
                208.70059
                            49.716503 43.506508
                                                   328.36798
                                                                     1434
                                                                                   37
         2512
         10128 176.45346
                            48.930611
                                       34.353111
                                                   307.13998
                                                                      821
                                                                                   30
                213.52023 43.328411 43.774151 326.38000
                                                                                   29
         7432
                                                                     1447
```

zagreb

```
3232
                    140
                    142
         5553
         2512
                    126
         10128
                    106
         7432
                    116
         [5 rows x 188 columns]
In [73]: test.shape
Out[73]: (2366, 188)
In [74]: # Check number of actives and inactives in test set
         n_pos1 = (test.ActivityScore >= 40).sum()
         n_neg1 = (test.ActivityScore < 40).sum()</pre>
         n_neg1, n_pos1
Out[74]: (1173, 1193)
In [75]: # Check number of actives and inactives in training set
         n_pos2 = (training.ActivityScore >= 40).sum()
         n_neg2 = (training.ActivityScore < 40).sum()</pre>
         n_neg2, n_pos2
Out[75]: (4741, 4721)
```

0.4 Write resulting training and test set to files for use in all further analyses.