Machine Learning Regression Model Report - Multispectral imaging

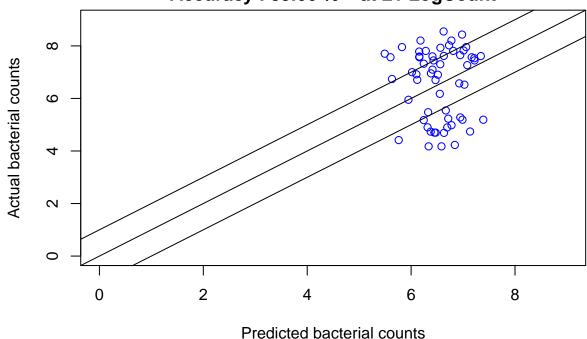
k-Nearest Neighbours for Total Viable Counts

```
## k-Nearest Neighbors
##
## 138 samples
##
  18 predictor
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
##
    k
        RMSE
                  Rsquared
##
     1 1.628877 0.07631172 1.243537
##
     2 1.540528 0.06889876 1.196526
##
     3 1.458107 0.07525481 1.160013
##
     4 1.410955 0.07756274 1.137011
##
     5 1.383676 0.07676612 1.113246
     6 1.348109 0.08423229 1.093800
     7 1.324584 0.09133435 1.073887
##
##
     8 1.304858 0.10084289 1.057953
##
     9 1.292287 0.10456589 1.051479
##
    10 1.282264 0.10860362 1.043588
##
    11 1.274284 0.11352365 1.036029
##
    12 1.264728 0.11964079 1.028379
##
    13 1.259579 0.12199076 1.026719
##
    14 1.252244 0.12784045 1.018962
##
    15 1.243733 0.13536835 1.011787
##
    16 1.244774 0.13470195 1.012879
##
    17 1.248375 0.12579566 1.018626
##
    18 1.251891 0.12048311 1.022001
##
    19 1.249402 0.12453075 1.023488
##
       1.255870 0.11879677 1.029441
## RMSE was used to select the optimal model using the smallest value.
## The final value used for the model was k = 15.
```

Total Viable Counts distribution - k-Nearest Neighbours

k-Nearest Neighbours RMSE: 1.4

Accuracy: 39.66 % - at ±1 LogCount

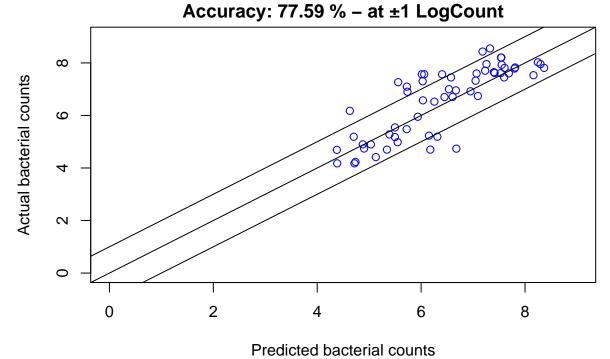


Linear Model for Total Viable Counts

```
## Linear Regression
##
## 138 samples
   18 predictor
##
## No pre-processing
## Resampling: Cross-Validated (10 fold, repeated 3 times)
## Summary of sample sizes: 124, 125, 123, 126, 124, 125, ...
## Resampling results:
##
##
     RMSE
                Rsquared
                           MAE
##
     0.7236853 0.7030126 0.6040175
##
## Tuning parameter 'intercept' was held constant at a value of TRUE
```

Total Viable Counts distribution - Linear Regression

Linear Regression RMSE: 0.77



Random Forest for Total Viable Counts

```
## Random Forest
##
## 138 samples
    18 predictor
##
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
##
     mtry
           RMSE
                     Rsquared
                                 MAE
                    0.1841859 0.9630549
##
      1
           1.188901
      2
           1.170060
                     0.2063113 0.9452098
##
##
      3
           1.161264
                     0.2201670
                                 0.9377782
##
      4
           1.156754
                     0.2253392
                               0.9324010
##
      5
           1.150935
                     0.2312156
                                 0.9266913
##
      6
           1.146597
                     0.2376249
                                 0.9212315
##
      7
           1.144505
                     0.2405144
                                 0.9212290
##
           1.142046
                     0.2435282 0.9193930
##
           1.141230
                    0.2441195 0.9176895
```

```
10
          1.138232 0.2484838 0.9147746
##
          1.137488 0.2497101 0.9131078
##
     11
##
          1.135517 0.2525015 0.9112199
##
     13
          1.132027 0.2559235 0.9079039
          1.134073 0.2549491 0.9095807
##
     14
##
     15
          1.137588 0.2508757 0.9099973
          1.136646 0.2536130 0.9100582
##
     16
          1.136792 0.2547193 0.9095905
##
     17
          1.134369 0.2569851 0.9096968
##
     18
          1.135515 0.2557435 0.9085800
##
     19
##
     20
          1.137550 0.2549353 0.9105189
##
     21
          1.137882 0.2541819 0.9112513
##
     22
          1.138924 0.2523766 0.9101218
##
     23
          1.136143 0.2557962 0.9099453
##
     24
          1.134835
                    0.2561576 0.9079689
##
     25
                    0.2524183 0.9108289
          1.137213
##
     26
          1.135381 0.2556186 0.9091418
##
     27
          1.134264
                    0.2554668 0.9068803
##
          1.138132 0.2531244 0.9111146
     28
##
     29
          1.135559 0.2541419 0.9080745
          1.136549 0.2525486 0.9099291
##
     30
##
```

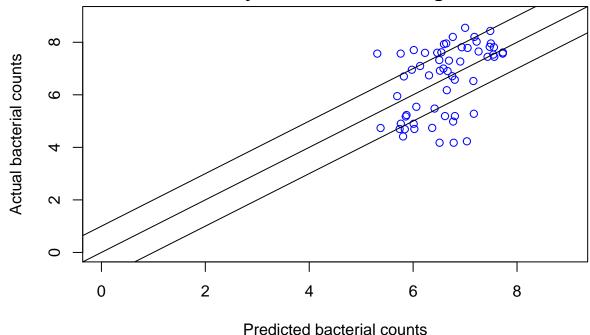
RMSE was used to select the optimal model using the smallest value.

The final value used for the model was mtry = 13.

Total Viable Counts distribution - Random Forests

Random Forests RMSE: 1.16

Accuracy: 58.62 % - at ±1 LogCount



Support Vector Machines with Polynomial Kernel for Total Viable Counts

```
## Support Vector Machines with Polynomial Kernel
##
## 138 samples
   18 predictor
##
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
     degree
##
                    C
                          RMSE
                                                 MAE
            scale
                                     Rsquared
##
             1e-03
                   0.25
                         1.3676301
                                     0.09253978
                                                 1.0526364
             1e-03 0.50 1.3576378
                                                 1.0418330
##
                                     0.11436081
     1
##
     1
             1e-03
                   1.00
                         1.3447874
                                     0.14142642
                                                 1.0258226
             1e-03 2.00 1.3229561
##
     1
                                     0.17469934
                                                 0.9991767
##
             1e-03
                   4.00
                          1.2892970
                                     0.21807947
                                                 0.9676240
##
     1
             1e-02 0.25 1.3146656
                                    0.18896765
                                                 0.9898902
##
     1
             1e-02 0.50 1.2739168
                                    0.22930067
                                                 0.9572206
             1e-02 1.00 1.2242615 0.28717548
                                                 0.9208566
##
     1
```

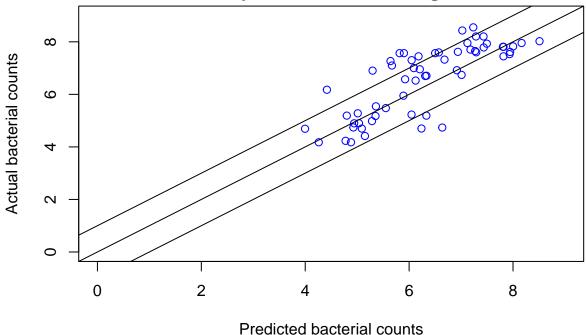
```
##
              1e-02 2.00 1.1509346
                                       0.36491743
                                                    0.8777510
     1
                     4.00
##
              1e-02
                           1.0547758
                                       0.46194316
                                                     0.8189233
     1
                            1.1242524
                                                     0.8619770
##
     1
              1e-01
                     0.25
                                        0.39484159
                            1.0225750
                                        0.48711874
                                                     0.7981973
##
     1
              1e-01
                     0.50
##
     1
              1e-01
                     1.00
                            0.9245739
                                        0.54757236
                                                     0.7297399
                                                     0.6867345
##
              1e-01
                     2.00
                           0.8628217
                                        0.58732377
     1
                                                     0.6659258
##
     1
              1e-01
                     4.00
                            0.8345130
                                        0.61291308
##
     1
              1e+00
                     0.25
                            0.8492290
                                        0.59791700
                                                     0.6763812
##
              1e+00
                     0.50
                            0.8260830
                                        0.62137573
                                                     0.6618675
     1
##
     1
              1e+00
                     1.00
                            0.8035463
                                        0.64297265
                                                     0.6493684
##
              1e+00
                     2.00
                           0.7890749
                                        0.65805040
                                                     0.6400528
     1
              1e+00
                                        0.67239067
                                                     0.6274016
##
     1
                     4.00
                           0.7727995
##
              1e+01
                     0.25
                            0.7843358
                                        0.66303873
                                                     0.6366435
     1
                     0.50
##
     1
              1e+01
                            0.7692698
                                        0.67543677
                                                     0.6246898
              1e+01
                                        0.67748857
                                                     0.6212147
##
     1
                     1.00
                            0.7661456
##
              1e+01
                     2.00
                            0.7721518
                                        0.67654938
                                                     0.6250640
     1
##
              1e+01
                     4.00
                            0.7887900
                                        0.66630463
                                                     0.6358592
     1
##
     2
              1e-03
                     0.25
                            1.3574861
                                        0.11445617
                                                     1.0418212
##
     2
             1e-03
                     0.50
                           1.3449095
                                        0.14231106
                                                     1.0259957
##
     2
              1e-03
                     1.00
                            1.3227719
                                        0.17647156
                                                     0.9992471
##
     2
              1e-03
                     2.00
                            1.2890448
                                        0.21929010
                                                     0.9671754
              1e-03
                                        0.26913136
                                                     0.9327727
##
     2
                     4.00
                            1.2410911
             1e-02
                                        0.22041267
##
     2
                     0.25
                            1.2774312
                                                     0.9611724
                            1.2295493
                                        0.27600059
                                                     0.9290269
##
     2
              1e-02
                     0.50
##
     2
              1e-02
                     1.00
                            1.1580789
                                        0.34645258
                                                     0.8858744
##
     2
             1e-02
                     2.00
                           1.0614462
                                        0.42988072
                                                     0.8209364
##
     2
              1e-02
                     4.00
                           0.9721790
                                        0.49952452
                                                     0.7548686
##
     2
              1e-01
                     0.25
                            1.0585318
                                       0.39047017
                                                     0.8189041
##
     2
              1e-01
                     0.50
                           1.0001907
                                        0.44391312
                                                     0.7741359
##
     2
              1e-01
                     1.00
                            0.9760972
                                        0.47291690
                                                     0.7601455
##
     2
              1e-01
                     2.00
                            0.9536689
                                        0.50449127
                                                     0.7537555
##
     2
              1e-01
                     4.00
                            0.9454659
                                        0.52377752
                                                     0.7519660
     2
##
              1e+00
                     0.25
                            1.0529717
                                        0.45222153
                                                     0.8212108
                                                     0.8419655
     2
              1e+00
                                        0.45118343
##
                     0.50
                            1.0799058
##
     2
              1e+00
                     1.00
                            1.1071367
                                        0.45045362
                                                     0.8666394
     2
                                        0.42618057
                                                     0.9281434
##
              1e+00
                     2.00
                           1.1891505
##
     2
              1e+00
                     4.00
                            1.2741221
                                        0.40875016
                                                     0.9870502
##
     2
              1e+01
                     0.25
                            1.6977033
                                        0.27431639
                                                     1.2640238
     2
                            1.8474663
                                        0.25114590
                                                     1.3626904
##
              1e+01
                     0.50
                                        0.23054046
     2
                            1.9812785
                                                     1.4471620
##
              1e+01
                     1.00
##
     2
             1e+01
                     2.00
                            2.0357445
                                        0.22125060
                                                     1.4813216
     2
                     4.00
                           2.0610812
                                        0.21794628
                                                     1.4975662
##
              1e+01
##
     3
              1e-03
                     0.25
                            1.3505266
                                        0.13076728
                                                     1.0333781
##
     3
              1e-03
                     0.50
                                        0.16101908
                                                     1.0111778
                            1.3315863
##
     3
              1e-03
                     1.00
                            1.3051090
                                        0.20180973
                                                     0.9810911
     3
              1e-03
                     2.00
                            1.2615842
                                                     0.9490091
##
                                        0.24169008
##
     3
              1e-03
                     4.00
                            1.2083516
                                        0.30753939
                                                     0.9104506
##
     3
              1e-02
                     0.25
                            1.2531271
                                        0.23573889
                                                     0.9477926
##
     3
              1e-02
                     0.50
                            1.1939533
                                        0.29818407
                                                     0.9107428
##
     3
              1e-02
                     1.00
                            1.1114518
                                        0.37717097
                                                     0.8559972
##
     3
                                                     0.7865700
              1e-02
                     2.00
                            1.0177586
                                        0.45288171
##
     3
              1e-02 4.00
                            0.9530155
                                        0.50118378
                                                     0.7440590
##
     3
              1e-01 0.25
                            1.0626304
                                        0.41051738
                                                     0.8280139
##
     3
              1e-01 0.50
                           1.0852208
                                       0.42096477
                                                    0.8440464
```

```
##
                    1.00 1.1492715
                                      0.41480486
                                                   0.8847046
##
     3
                    2.00
                           1.2214640
                                      0.40746119
                                                   0.9234563
             1e-01
##
     3
                     4.00
                           1.3161489
                                       0.38200657
                                                   0.9879433
     3
##
             1e+00
                     0.25
                           2.4404176
                                       0.19424901
                                                   1.6893924
##
     3
                     0.50
                           2.5459452
                                       0.18415106
                                                   1.7565941
     3
                    1.00
                           2.5567404
                                       0.18349190
                                                   1.7616413
##
##
     3
                    2.00
                           2.5567404
                                       0.18349190
                           2.5567404
##
     3
             1e+00
                    4.00
                                       0.18349190
                                                   1.7616413
##
     3
             1e+01
                     0.25
                           3.7945211
                                       0.12309847
                                                   2.4624198
                    0.50
                                                   2.4624198
##
     3
             1e+01
                           3.7945211
                                       0.12309847
##
     3
             1e+01
                    1.00
                           3.7945211
                                       0.12309847
                                                   2.4624198
##
     3
             1e+01
                    2.00
                           3.7945211
                                       0.12309847
                                                   2.4624198
                           3.7945211
                                      0.12309847
##
                     4.00
                                                   2.4624198
##
## RMSE was used to select the optimal model using the smallest value.
## The final values used for the model were degree = 1, scale = 10 and C = 1.
```

Total Viable Counts distribution - Support Vector Machines with Polynomial Kernel

Support Vector Machines with Polynomial Kernel RMSE: 0.86

Accuracy: 74.14 % - at ±1 LogCount



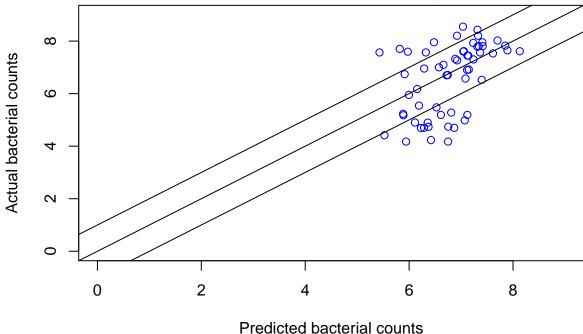
Support Vector Machines with Radial Basis Function Kernel for Total Viable Counts

```
## Support Vector Machines with Radial Basis Function Kernel
## 138 samples
## 18 predictor
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
    C
          RMSE
                    Rsquared MAE
##
    0.25 1.209806 0.2458085 0.9321366
    0.50 1.166212 0.2674341 0.9041694
##
##
    1.00 1.132044 0.2907852 0.8819976
## Tuning parameter 'sigma' was held constant at a value of 0.08788172
## RMSE was used to select the optimal model using the smallest value.
## The final values used for the model were sigma = 0.08788172 and C = 1.
```

Total Viable Counts distribution - Support Vector Machines with Radial Basis Function Kernel

Support Vector Machines with Radial Basis Function Kernel RMSE: 1.15

Accuracy: 58.62 % - at ±1 LogCount



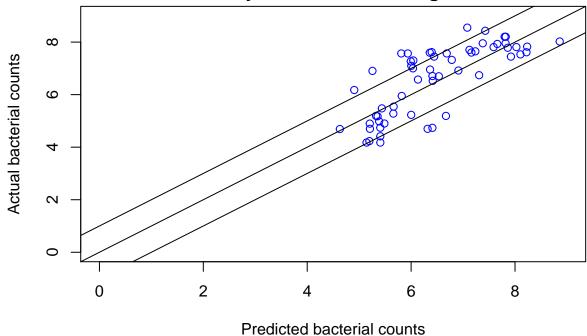
Support Vector Machines with Linear Kernel for Total Viable Counts

```
## Support Vector Machines with Linear Kernel
##
## 138 samples
   18 predictor
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results:
##
##
    RMSE
                Rsquared
                           MAE
     0.8387273 0.6353293 0.6790855
##
## Tuning parameter 'C' was held constant at a value of 1
```

Total Viable Counts distribution - Support Vector Machines with Linear Kernel

Support Vector Machines with Linear Kernel RMSE: 0.85

Accuracy: 72.41 % - at ±1 LogCount

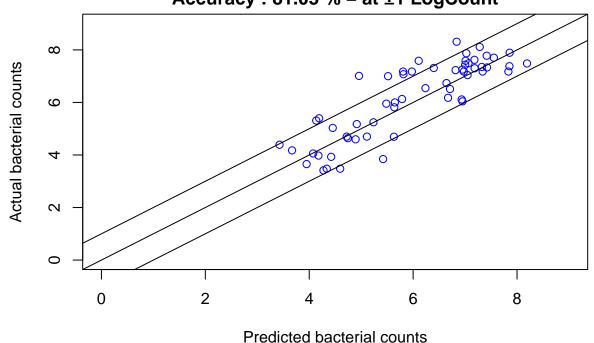


Linear Regression for Pseudomonas count

```
## Linear Regression
##
## 138 samples
   18 predictor
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results:
##
##
    RMSE
                Rsquared MAE
    0.9018537 0.623495 0.7242078
##
## Tuning parameter 'intercept' was held constant at a value of TRUE
```

Pseudomonas count distribution - Linear Regression

Linear Regression RMSE: 0.77 Accuracy : 81.03 % – at ±1 LogCount



k-Nearest Neighbors for Pseudomonas count

```
## k-Nearest Neighbors
##
## 138 samples
   18 predictor
##
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
##
     k
         RMSE
                   Rsquared
                               MAE
        1.802243
                  0.05546741
                               1.375047
##
      1
         1.655395
                   0.06903053
                               1.266341
##
##
        1.579494
                   0.07674866
                               1.228527
        1.500408 0.08947601
                              1.183179
##
##
        1.464973 0.09318193
                               1.168453
##
      6
         1.423114
                  0.10435305
                               1.144412
##
      7
        1.409726 0.10514684
                               1.142439
##
        1.405345 0.10195844
                               1.143662
##
        1.395716 0.10335157
                              1.136140
```

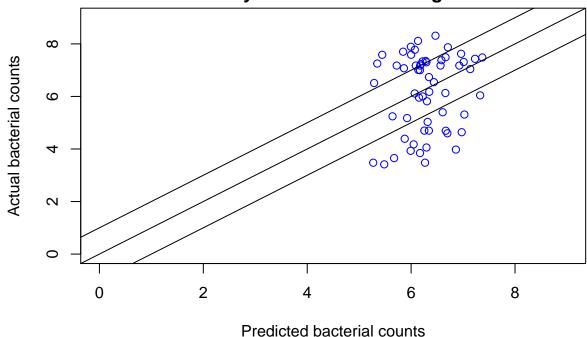
```
##
    10 1.391819 0.10070734 1.133982
    11 1.381842 0.10361957 1.132392
##
##
    12 1.365477 0.11582739 1.119393
##
       1.373494 0.10354011
    13
                             1.130199
##
        1.367918 0.10429634
                             1.127995
##
    15
       1.362717 0.10671975
                            1.131448
##
       1.367447
                 0.10265767
                             1.139331
        1.373960 0.09653224
##
    17
                             1.148381
##
    18
        1.372610 0.09719171
                             1.146859
##
    19
        1.380481
                 0.08622640 1.156282
##
    20
       1.382652 0.08463720
                             1.161897
##
    21
       1.384240 0.08042581
                             1.167150
    22 1.387457 0.07556320 1.173572
##
##
       1.387959
                 0.07494243 1.174797
    23
##
    24 1.394417
                  0.07120362
                             1.182651
##
    25
        1.397370
                  0.06753618
                             1.186496
##
       1.396697
                  0.06691320 1.185932
    26
##
    27
       1.397408
                 0.06442330
                             1.186580
##
       1.400129 0.05861022 1.189993
    28
##
    29
        1.402177 0.05556277
                             1.193019
##
    30
       1.399274 0.05781532 1.190742
##
        1.399815 0.05561283 1.191632
    31
##
       1.401270 0.05206061
                             1.193260
    32
##
        1.401860 0.05207312 1.194276
    33
##
    34 1.403129 0.05176167 1.195678
##
    35
       1.403378 0.05168143 1.198561
##
    36
       1.402083 0.05405971
                             1.197215
##
        1.401814 0.05302619 1.197706
    37
##
    38
       1.403350 0.05001614 1.200067
        1.402941 0.04962366 1.200396
##
    39
##
    40
       1.404510 0.04726071 1.201995
##
## RMSE was used to select the optimal model using the smallest value.
```

The final value used for the model was k = 15.

Pseudomonas count distribution - k-Nearest Neighbors

k-Nearest Neighbors RMSE: 1.44

Accuracy: 36.21 % - at ±1 LogCount



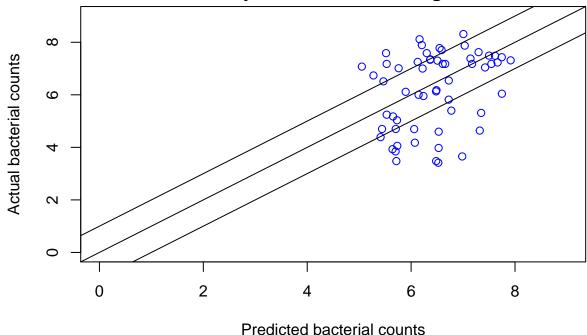
Random Forests for Pseudomonas count

```
## Random Forest
##
## 138 samples
   18 predictor
##
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
##
     mtry
           RMSE
                     Rsquared
                                MAE
                     0.2073877
                               1.032475
##
     2
           1.278884
           1.273923
                     0.2258058
                                1.010466
##
     10
##
           1.281386
                     0.2272474
                                1.013910
##
## RMSE was used to select the optimal model using the smallest value.
## The final value used for the model was mtry = 10.
```

Pseudomonas count distribution - Random Forests

Random Forests RMSE: 1.41

Accuracy: 48.28 % - at ±1 LogCount



Support Vector Machines with Polynomial Kernel for Pseudomonas count

```
## Support Vector Machines with Polynomial Kernel
##
## 138 samples
   18 predictor
##
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
##
     degree scale
                   C
                          RMSE
                                    Rsquared
                                                MAE
##
            0.001 0.25
                         1.498815
                                    0.08671280
                                                1.2085891
            0.001 0.50 1.490548
                                                1.2004254
##
                                    0.09157661
     1
##
     1
            0.001 1.00 1.476151
                                    0.11743751
                                                1.1841817
            0.010 0.25 1.441459
##
     1
                                    0.14467394
                                                1.1412708
##
            0.010 0.50
                         1.388721
                                    0.18625010
                                                1.0938515
            0.010 1.00 1.322276
                                   0.24445597
##
     1
                                                1.0388502
##
     1
            0.100 0.25 1.230259
                                    0.33165599
                                               0.9705950
                                    0.40945286 0.9159509
            0.100 0.50 1.155914
##
     1
```

```
0.100 1.00 1.081890 0.47339853 0.8600469
##
     1
            0.001 \quad 0.25 \quad 1.490375 \quad 0.09201551 \quad 1.2002851
##
     2
     2
            0.001 0.50 1.475767
                                   0.11882243 1.1838592
##
##
     2
            0.001 1.00 1.452244
                                   0.13749271 1.1542460
            0.010 0.25 1.380201
                                   0.20256241 1.0802025
##
     2
##
    2
            0.010 0.50 1.318839
                                   0.25102031 1.0245075
##
     2
            0.010 1.00 1.249904 0.31026211 0.9727546
            0.100 0.25 1.183395 0.35613040 0.9375475
##
     2
##
     2
            0.100 0.50 1.132691
                                   0.40035254 0.9011227
##
     2
            0.100 \quad 1.00 \quad 1.109878 \quad 0.42418939 \quad 0.8799024
##
     3
            0.001 0.25 1.483127
                                   0.10662421 1.1920621
##
            0.001 0.50 1.465480
                                   0.13270366 1.1694440
     3
##
     3
            0.001 1.00 1.425583 0.16197226 1.1272731
            0.010 0.25 1.346100 0.21848618 1.0481109
##
     3
##
    3
            0.010 0.50 1.283780
                                   0.27131575 0.9997789
            0.010 1.00 1.214849
##
     3
                                   0.33417540 0.9544008
##
     3
            0.100 0.25 1.245176
                                   0.32308927 0.9708177
##
     3
            0.100 0.50 1.261190
                                   0.34443858 0.9784025
            0.100 1.00 1.310914 0.33367670 1.0049243
##
    3
##
```

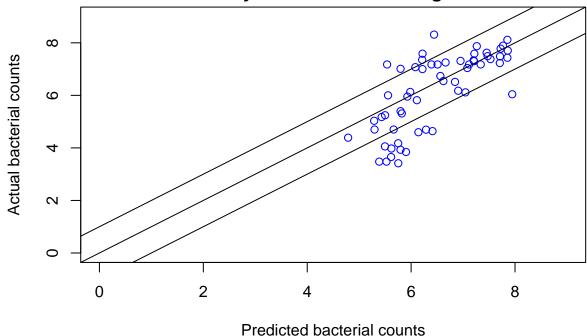
 $\mbox{\tt \#\#}$ RMSE was used to select the optimal model using the smallest value.

The final values used for the model were degree = 1, scale = 0.1 and ${\tt C}$ = 1.

Pseudomonas count distribution - Support Vector Machines with Polynomial Kernel

Support Vector Machines with Polynomial Kernel RMSE: 1.04

Accuracy: 68.97 % - at ±1 LogCount



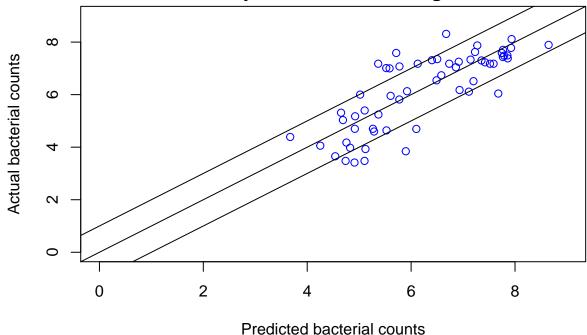
Support Vector Machines with Linear Kernel for Pseudomonas count

```
## Support Vector Machines with Linear Kernel
## 138 samples
   18 predictor
##
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results:
##
##
    RMSE
                Rsquared
                           MAE
     0.9496852 0.5848639 0.7452106
##
## Tuning parameter 'C' was held constant at a value of 1
```

Pseudomonas count distribution - Support Vector Machines with Linear Kernel

Support Vector Machines with Linear Kernel RMSE: 0.88

Accuracy: 75.86 % - at ±1 LogCount



Support Vector Machines with Radial Basis Function Kernel for Pseudomonas count

```
## Support Vector Machines with Radial Basis Function Kernel
##
## 138 samples
   18 predictor
## No pre-processing
## Resampling: Bootstrapped (25 reps)
## Summary of sample sizes: 138, 138, 138, 138, 138, 138, ...
## Resampling results across tuning parameters:
##
##
     С
           RMSE
                     Rsquared
                                MAE
##
     0.25
           1.370191
                     0.1973470
                                1.087674
##
     0.50
           1.323962
                     0.2256414
                                1.057805
          1.284950
                     0.2587782 1.027601
##
     1.00
## Tuning parameter 'sigma' was held constant at a value of 0.07967483
## RMSE was used to select the optimal model using the smallest value.
```

The final values used for the model were sigma = 0.07967483 and C = 1.

Pseudomonas count distribution - Support Vector Machines with Radial Basis Function Kernel

Support Vector Machines with Radial Basis Function Kernel RMSE: 1.36

Accuracy: 55.17 % - at ±1 LogCount

