

# CS678 Assignment 2

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October 26, 2015

## 1 Info

For question 1, subsets of the datasets are chosen:

1. Covtypes : 100 pts train, 300 pts test
2. rcv1: 40 pts train, 120 pts test

For SMO, the implementation follows the pseudocode given in Platt's paper

## 2 Liblinear

The training times as well as the testing time are of the orders of a few seconds, even with the full datasets. Detailed parameter tuning tables and related data can be found in the ipython notebook `liblinear_tests.ipynb`

Note: The lower accuracy on rcv1 with scaling as compared with without is probably because when scaling the test data, many columns were not available in the original data hence the scaling was imperfect.

| Dataset          | Train time(sec)    | Stopping Criteria | Iterations   | Accuracy                |
|------------------|--------------------|-------------------|--------------|-------------------------|
| leukemia         | (2.37, 2.37, 2.37) | (1, 2*, 3*)       | (14, 16, 13) | (73.52, 73.52, 73.52) % |
| leukemia, scaled | 2.53               | 1                 | 13           | 64.7%                   |
| leukemia, scaled | 3.14               | 2                 | 14           | 64.8%                   |
| leukemia, scaled | 3.56               | 3*                | 16           | 64.7%                   |
| rcv1             | 2.91               | 1                 | 13           | 83.19%                  |
| rcv1             | 3.38               | 2*                | 14           | 84.03%                  |
| rcv1-scaled      | (2.99, 3.76, 3.61) | (1, 2*, 3*)       | (14, 15, 13) | (86.55, 86.55, 86.55)   |
| covtype          | 9.04               | 1                 | 18           | 44.81 %                 |
| covtype          | 12.58              | 2*                | 24           | 57.19 %                 |
| covtype          | 12.01              | 3*                | 18           | 60.86%                  |

Table 1: Chunking

| Dataset          | Train time(sec)    | Stopping Criteria | Iterations | Accuracy |
|------------------|--------------------|-------------------|------------|----------|
| leukemia         | 15.40              | 1                 | 38         | 82.35 %  |
| leukemia, scaled | 25.81              | 1                 | 13         | 88.23%   |
| rcv1             | 10.19              | 1                 | 23         | 85.71%   |
| rcv1-scaled      | (2.99, 3.76, 3.61) | 1                 | 23         | 86.55    |
| covtype          | 90.56              | 1                 | 594        | 66.88 %  |

Table 2: SMO

| Dataset                  | C        | Reported Accuracy      |
|--------------------------|----------|------------------------|
| leukemia                 | 0.25     | 79.41% (27/34)         |
| leukemia with scaling    | 0.5      | 88.23% (30/34)         |
| rcv1                     | 1        | 96.15% (651374/677399) |
| rcv1 with scaling        | 0.0625   | 96.05% (650654/677399) |
| covtype (already scaled) | 0.015625 | 63.36% (73632/116202)  |

Table 3: Liblinear results

### 3 LibSVM

1. The training times reported are with 5 fold cross validation.
2. Apart from these, subsets of the data(as indicated in the ratios in the tables) are used since each run (with one set of parameters) on rcv and covtypes takes 28 mins
3. Training set size: rcv: 300, covtypes: 1000
4. Only the c parameter is reported in these tables, the full data is available in `libsvm_tests.ipynb`

Further details about parameters can be found in `libsvm_tests.ipynb`

| Dataset                  | Final C | Train time(sec) | Reported Accuracy   |
|--------------------------|---------|-----------------|---------------------|
| leukemia                 | 0.25    | 1.10            | 82.35% (28/34)      |
| leukemia with scaling    | 0.25    | 1.19            | 88.23% (30/34)      |
| rcv1                     | 1       | 3.14            | 77.56% (930/1199)   |
| rcv1 with scaling        | 0.625   | 3.04            | 77.64% (931/1199)   |
| covtype (already scaled) | 1       | 1.30            | 19.7991% (690/3485) |

Table 4: LibSVM linear kernel

| <b>Dataset</b>           | <b>Final C</b> | <b>Train time(sec)</b> | <b>Reported Accuracy</b> |
|--------------------------|----------------|------------------------|--------------------------|
| leukemia                 | 0.25           | 16.88                  | 70.58% (24/34)           |
| leukemia with scaling    | 0.25           | 17.03                  | 88.23% (30/34)           |
| rcv1                     | 1              | 41.51                  | 79.89% (958/1199)        |
| rcv1 with scaling        | 0.625          | 45.22                  | 85.40% (1024/1199)       |
| covtype (already scaled) | 1              | 290.08                 | 23.64% (824/3485)        |

Table 5: LibSVM polynomial kernel degree 2

| <b>Dataset</b>           | <b>Final C</b> | <b>Train time(sec)</b> | <b>Reported Accuracy</b> |
|--------------------------|----------------|------------------------|--------------------------|
| leukemia                 | 4              | 16.88                  | 61.76% (21/34)           |
| leukemia with scaling    | 4              | 17.03                  | 91.17% (31/34)           |
| rcv1                     | 1              | 41.51                  | 56.71% (680/1199)        |
| rcv1 with scaling        | 4              | 45.22                  | 81.65% (979/1199)        |
| covtype (already scaled) | 1              | 290.08                 | 29.84% (895/2999)        |

Table 6: LibSVM polynomial kernel degree 3

| <b>Dataset</b>           | <b>Final C</b> | <b>Train time(sec)</b> | <b>Reported Accuracy</b> |
|--------------------------|----------------|------------------------|--------------------------|
| leukemia                 | 4              | 7.79                   | 58.82% (20/34)           |
| leukemia with scaling    | 4              | 9.77                   | 58.82% (20/34)           |
| rcv1                     | 16             | 22.40                  | 79.23% (950/1199)        |
| rcv1 with scaling        | 16             | 22.94                  | 82.23% (986/1199)        |
| covtype (already scaled) | 16             | 11.40                  | 31.54% (946/2999)        |

Table 7: LibSVM RBF Kernel