CD-HIT vs. CD-HIT + graphpart

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General remarks

If we use graphpart we cannot predict Sec proteins.

Moreover, PlastoGram performance drops for Tat, stromal proteins (mostly plastid-encoded) and nuclear-encoded transmembrane proteins.

Sec and TAT issue is mostly related to the number of sequences in the independent data set. Additional graphpart reduction removes 2 out of 6 sequences for Sec (33%) and for Tat 6 out of 12 (50%). Similarly, for plastid-encoded stromal proteins we are losing 21 proteins out of 63 (33%).

The unexplained phenomenon is a huge loss of accuracy for nuclear-encoded transmembrane proteins, when graphpart removes only few proteins in the independent dataset, but suddenly PlastoGram staerts to confuse this proteins with nuclear-encoded stromal proteins.

Datasets

CD-HIT + graphpart

- 1. CD-HIT reduction using 0.9 threshold
- 2. Graph-part partitioning to create independent and train-test datasets. Parameters: 0.4 threshold, 0.15 ratio of validation dataset, no moving between clusters.
- 3. N_IM and N_OM are reduced/partitioned separately and then grouped together as envelope.

| Dataset | Before filtering | After CD-HIT | After partitioning(traintest) | After partition- ing(independent) |
|---------------|---------------------|---------------------|-------------------------------|--------------------------------------|
| N_E | 118 (59 IM + 59 OM) | 115 (59 IM + 56 OM) | 96 (50 IM + 46 OM) | 10 (6 IM + 4 OM) |
| N_{TM} | 276 | $222^{'}$ | 192 | 30 |
| N_S | 357 | 340 | 287 | 53 |
| N_{TL_SEC} | 49 | 43 | 37 | 4 |
| N_TL_TAT | 84 | 89 | 67 | 6 |
| P_IM | 187 | 128 | 106 | 11 |
| P_TM | 4456 | 1237 | 1073 | 156 |
| P_S | 1417 | 419 | 360 | 42 |

CD-HIT

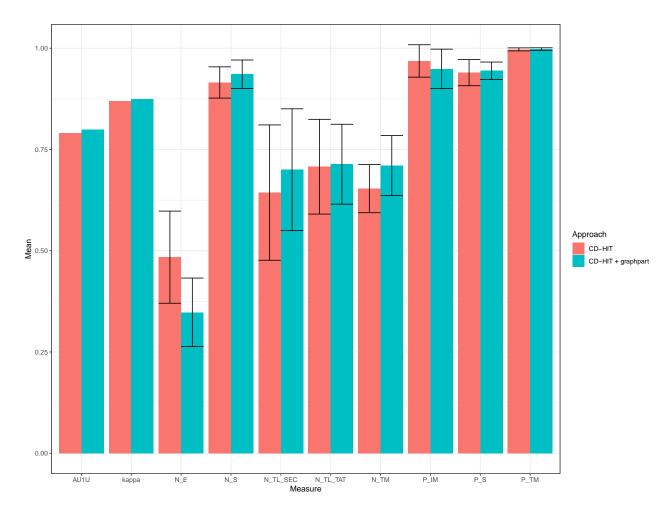
- 1. CD-HIT reduction using 0.9 threshold
- 2. 15% holdout to create independent dataset
- 3. N_IM and N_OM are reduced/partitioned separately and then grouped together as envelope.

| Data set | Before filtering | After filtering | Train-test | Independent |
|---------------|---------------------|---------------------|--------------------|------------------|
| N_E | 118 (59 OM + 59 IM) | 115 (56 OM + 59 IM) | 98 (48 OM + 50 IM) | 17 (8 OM + 9 IM) |
| N_{TM} | 276 | 222 | 189 | 33 |
| N_S | 357 | 340 | 289 | 51 |
| N_{TL_SEC} | 49 | 43 | 37 | 6 |
| N_TL_TAT | 84 | 79 | 67 | 12 |
| P_IM | 187 | 128 | 109 | 19 |
| P_{TM} | 4456 | 1237 | 1051 | 186 |
| P_S | 1417 | 419 | 356 | 63 |

Mean performance in 10-fold CV reapeated 5x

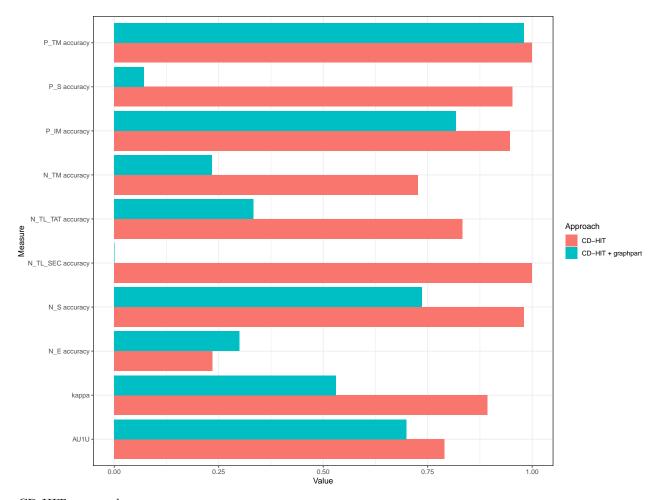
Both CD-HIT only and CD-HIT+graph part approaches lead to the same best architecture: Architecture_v71_0-1_No_filtering_RF.

| Measure | CD-HIT | CD-HIT + graphpart |
|----------------------|-----------|--------------------|
| mean_kappa | 0.8694610 | 0.8745206 |
| $mean_AU1U$ | 0.7912053 | 0.7996173 |
| $mean_N_E_sens$ | 0.4841053 | 0.3480000 |
| $mean_N_TM_sens$ | 0.6532859 | 0.7102294 |
| $mean_N_S_sens$ | 0.9154628 | 0.9358742 |
| $mean_N_TL_SEC_sens$ | 0.6435714 | 0.7000000 |
| $mean_N_TL_TAT_sens$ | 0.7074725 | 0.7136264 |
| $mean_P_IM_sens$ | 0.9685714 | 0.9490043 |
| $mean_P_TM_sens$ | 0.9971456 | 0.9979483 |
| $mean_P_S_sens$ | 0.9398200 | 0.9444444 |
| $sd_N_E_sens$ | 0.1137329 | 0.0845621 |
| $sd_N_TM_sens$ | 0.0593983 | 0.0741940 |
| $sd_N_S_sens$ | 0.0385892 | 0.0350118 |
| $sd_N_TL_SEC_sens$ | 0.1670598 | 0.1504075 |
| $sd_N_TL_TAT_sens$ | 0.1169723 | 0.0986722 |
| $sd_P_{IM}_{sens}$ | 0.0399679 | 0.0487234 |
| $sd_P_TM_sens$ | 0.0037315 | 0.0031084 |
| $sd_P_S_sens$ | 0.0323924 | 0.0214219 |



Performance on the validation dataset

| Measure | CD-HIT | CD-HIT + graphpart |
|-------------------|-----------|--------------------|
| kappa | 0.8931102 | 0.5304225 |
| AU1U | 0.7896798 | 0.6989366 |
| N_E accuracy | 0.2352941 | 0.3000000 |
| N_TM accuracy | 0.7272727 | 0.23333333 |
| N_S accuracy | 0.9803922 | 0.7358491 |
| N_TL_SEC accuracy | 1.0000000 | 0.0000000 |
| N_TL_TAT accuracy | 0.8333333 | 0.3333333 |
| P_IM accuracy | 0.9473684 | 0.8181818 |
| P_TM accuracy | 1.0000000 | 0.9807692 |
| P_S accuracy | 0.9523810 | 0.0714286 |



CD-HIT approach

| True \ Predicted | N_E | N_S | N_TL_SEC | N_TL_TAT | N_TM | P_IM | P_S | P_TM |
|------------------|-----|-----|----------|----------|------|------|-----|------|
| N_E | 4 | 11 | 0 | 0 | 1 | 0 | 0 | 1 |
| N_S | 1 | 50 | 0 | 0 | 0 | 0 | 0 | 0 |
| N_{TL_SEC} | 0 | 0 | 6 | 0 | 0 | 0 | 0 | 0 |
| N_TL_TAT | 0 | 1 | 0 | 10 | 1 | 0 | 0 | 0 |
| N_{TM} | 0 | 5 | 0 | 0 | 24 | 0 | 0 | 4 |
| P_IM | 0 | 0 | 0 | 0 | 0 | 18 | 0 | 1 |
| P_S | 0 | 1 | 0 | 0 | 0 | 0 | 60 | 2 |
| P_{TM} | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 186 |

 $\operatorname{CD-HIT}$ + graphpart approach

| True \ Predicted | N_E | N_S | N_TL_SEC | N_TL_TAT | N_TM | P_IM | P_S | P_TM |
|------------------|-----|-----|----------|----------|------|------|-----|------|
| N_E | 3 | 6 | 0 | 0 | 0 | 0 | 0 | 1 |
| N_S | 1 | 39 | 0 | 0 | 8 | 0 | 4 | 1 |
| N_TL_SEC | 0 | 2 | 0 | 1 | 1 | 0 | 0 | 0 |
| N_TL_TAT | 0 | 3 | 0 | 2 | 0 | 0 | 0 | 1 |
| N_{TM} | 1 | 15 | 2 | 0 | 7 | 0 | 0 | 5 |
| P_{IM} | 0 | 0 | 0 | 0 | 0 | 9 | 0 | 2 |
| P_S | 0 | 24 | 0 | 0 | 0 | 0 | 3 | 15 |

| True \ Predicted | N_E | N_S | N_TL_SEC | N_TL_TAT | N_TM | P_IM | P_S | P_TM |
|------------------|-----|-----|----------|----------|------|------|-----|------|
| P_TM | 0 | 1 | 0 | 0 | 1 | 0 | 1 | 153 |