

TABLE 7. Performance Comparison (Execution Time, Memory Usage and CPU Usage) of Imbalanced vs. Balanced Sampling Methods. The base performance for each model is reported on imbalanced data (IB), with the values in square brackets indicating the difference when applying balanced-oversampling (BDO), balanced-undersampling (BDU), and balanced-hybridsampling (BDH).

| Method | Execution Time (s) IB [BDO, BDU, BDH] | Memory Usage (GB) IB [BDO, BDU, BDH] | CPU Usage (%) IB [BDO, BDU, BDH] |
|--|---|--|--|
| Without hyper-parameter Tuning (WHT) | | | |
| Autoencoder | 32866 [-2959, -3271, -2316] | 15.62 [+0.47, -7.36, -0.19] | 20.07 [+3.09, -14.01 , +15.53] |
| Decision Trees | 3105 [-996, -2594 , +821] | 7.97 [-3.48, -3.54, -3.50] | 14.38 [+1.12, -7.95, +8.63] |
| Gaussian Naive Bayes | 2725 [-1414, -1953, -624] | 1.15 [-0.05 , 0.00, -0.05] | 9.44 [-2.04, -2.34, -1.44] |
| Isolation Forest | 1982 [+118, -1102, +2040] | 2.60 [-0.35, -1.10, -0.56] | 7.22 [+1.78, -0.42, -0.21] |
| KNN | 4550 [-1095, -3330, -2650] | 9.40 [-2.60, -4.25, -2.80] | 11.10 [+0.10, -2.70, -2.00] |
| LightGBM | 6123 [-1633, -4473, -2973] | 3.50 [-0.30, +0.30, +0.30] | 12.50 [+0.90, -2.30, +1.70] |
| Random Forest | 7100 [-980, -2661, -1980] | 4.31 [-0.06, -0.11, -0.01] | 18.80 [-1.80, -5.70, -2.10] |
| Robust Covariance | 1432 [+548, -292, +8] | 1.94 [-0.22, -0.29, +0.05] | 6.55 [+0.70, -0.44, +0.95] |
| XGBoost | 5450 [-2262, -3063, -2120] | 2.90 [-0.25, +1.32, -0.40] | 23.20 [-3.30, -3.49, -2.50] |
| ADMXGB | 755 [-223, -632 , +3016] | 3.34 [-0.54, -1.03 , -0.30] | 60.20 [+18.30, -41.90 , +0.60] |
| With hyper-parameter Tuning (HT) - Grid Search | | | |
| Autoencoder | 49705 [+4004, -4675, +6341] | 13.39 [+8.90, -3.36, +9.24] | 9.62 [+3.45, +0.05, +1.46] |
| Decision Trees | 22133 [+31958, -16923, +7634984] | 9.02 [+0.30, -4.29, -3.25] | 6.14 [+1.87, +1.74, +0.97] |
| Gaussian Naive Bayes | 3341 [-786, -2161 , -740] | 1.20 [-0.05 , -0.04, -0.02] | 8.35 [-0.80, -1.15, -0.80] |
| Isolation Forest | 3120 [+101, -1730, +1440] | 2.70 [-0.20, -0.90, -0.40] | 7.60 [+1.90, -0.80, +0.20] |
| KNN | 4160 [+418, -2650, -1290] | 6.20 [+0.90, -0.70, +0.90] | 8.10 [+2.10, +0.60, +1.40] |
| LightGBM | 7542 [-652, -5431, -3543] | 3.85 [-0.15, +0.15, +0.25] | 14.45 [+0.15, -3.65, +0.05] |
| Random Forest | 9100 [-1980, -5078, -3485] | 4.80 [-0.30, -0.65, -0.42] | 17.30 [-0.50, -4.80, -1.20] |
| Robust Covariance | 2288 [-44, -1044, -738] | 2.10 [-0.32, -0.40, -0.05] | 6.90 [+0.40, -0.65 , +0.80] |
| XGBoost | 6811 [-3421, -3961, -3291] | 2.70 [+0.02, +0.40, 0.00] | 98.70 [-0.05, -0.15, +0.85] |
| ADMXGB | 4578 [+271, -1088 , +243] | 2.55 [+0.93, -1.48 , +0.94] | 71.30 [+24.10, +20.40, +13.30] |
| With hyper-parameter Tuning (HT) - Random Search | | | |
| Autoencoder | 33452 [-5129, -3070, +42847] | 26.74 [+36.75, -12.76, +21.39] | 7.34 [+6.20, -3.63, -0.29] |
| Decision Trees | 18364 [+1394, -12286, +6328] | 9.02 [+2.90, -6.42, -2.36] | 4.69 [+3.61, -1.67 , -0.17] |
| Gaussian Naive Bayes | 4781 [-2580, -3621 , -2091] | 1.25 [0.00, -0.12 , -0.05] | 7.90 [0.00, -0.90, -0.30] |
| Isolation Forest | 4012 [-1022, -2432, +865] | 2.80 [-0.25, -0.95, -0.40] | 7.22 [+1.88, -0.62, +0.68] |
| KNN | 2988 [+2034, -1198, +122] | 6.40 [+0.80, -0.68, +0.80] | 7.80 [+3.00, +1.10, +2.00] |
| LightGBM | 6225 [-437, -3980, -2105] | 3.60 [0.00, +0.50, +0.65] | 12.00 [+1.90, -1.10, +2.80] |
| Random Forest | 8144 [-1169, -3989, -2254] | 4.65 [-0.10, -0.45, -0.25] | 16.90 [-0.50, -4.10, -0.40] |
| Robust Covariance | 2109 [+221, -810, -499] | 2.00 [-0.18, -0.27, +0.08] | 6.25 [+1.30, +0.10, +1.55] |
| XGBoost | 5493 [-2053, -2498, -1883] | 2.80 [-0.05, +0.40, -0.05] | 48.00 [+0.51, -0.29, +0.91] |
| ADMXGB | 3225 [+888, -3161 , +5425] | 2.41 [+3.45, -1.35 , +1.63] | 48.10 [+38.00, -35.50 , +2.30] |
| With hyper-parameter Tuning (HT) - HyperOPT | | | |
| Autoencoder | 15551 [+4336, -12321, +33004] | 15.30 [+23.40, -3.80, +23.10] | 6.80 [+5.30, -2.70, +0.00] |
| Decision Trees | 17549 [+5231, -12269, +5537] | 9.00 [+3.15, -6.30, -2.05] | 4.55 [+4.65, -1.30 , +0.65] |
| Gaussian Naive Bayes | 5200 [-2745, -4102 , -2405] | 1.30 [+0.00, -0.16 , -0.05] | 7.33 [+0.47, -0.23, +0.37] |
| Isolation Forest | 2881 [+630, -1260, +2241] | 2.90 [-0.30, -1.06, -0.40] | 7.10 [+2.40, -0.20, +1.00] |
| KNN | 3555 [+2456, -1715, -145] | 6.10 [+1.40, -0.32, +1.20] | 8.40 [+2.80, +0.40, +1.50] |
| LightGBM | 4922 [+1433, -2272, -392] | 3.55 [+0.15, +0.60, +0.83] | 11.45 [+2.75, -0.55, +3.75] |
| Random Forest | 6741 [+1147, -2761, -719] | 4.62 [+0.08, -0.37, -0.12] | 16.50 [+0.75, -4.00, +0.30] |
| Robust Covariance | 1399 [+1051, -44, +326] | 2.05 [-0.17, -0.28, +0.05] | 6.20 [+1.45, +0.30, +1.65] |
| XGBoost | 4288 [-698, -1408, -538] | 2.10 [+0.75, +1.05, +0.70] | 63.10 [-0.08, -0.78, +0.07] |
| ADMXGB | 1484 [+399, -1387 , +414] | 11.56 [-5.88, -10.49 , -4.32] | 65.40 [+20.70, -23.00 , +13.00] |