

B3clf: A Resampling-Integrated Machine Learning Framework to Predict Blood-Brain Barrier Permeability

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List of Tables

| | |
|--|----|
| SI. 1 External dataset with compound identifiers and BBB permeability labels. For the most updated version of the extended B3DB dataset, please refer to https://github.com/theochem/B3DB | 15 |
| SI. 2 Evaluation metrics results of all classification model–sampling strategy combinations on the test dataset | 40 |

List of Figures

| | |
|---|----|
| SI. 1 Workflow for (A) dataset preparation, (B) molecular feature generation, (C) and (D) feature filtering | 4 |
| SI. 2 Two-stage stratified 10-fold cross-validation workflow for hyperparameter selection and model evaluation | 5 |
| SI. 3 Model performances of decision trees based classifiers for 10 groups of hyperparameters | 5 |
| SI. 4 Model performances of kNN based classifiers for 10 groups of hyperparameters | 6 |
| SI. 5 Model performances of logistical regression based classifiers for 10 groups of hyperparameters | 7 |
| SI. 6 Model performances of XGBoost based classifiers for 10 groups of hyperparameters | 8 |
| SI. 7 Summary of model performance across all classification model–sampling strategy combinations | 9 |
| SI. 8 Summary of model performance across all classification model–sampling strategy combinations, organized by sampling strategies | 10 |
| SI. 9 Summary of model performance across all classification model–sampling strategy combinations, organized by classification algorithms | 11 |

| | |
|--|----|
| SI. 10 Receiver operating characteristic (ROC) curves of all classification model–sampling strategy combinations | 12 |
| SI. 11 Precision-recall curves of all classification model–sampling strategy combinations | 13 |
| SI. 12 Relationship between number of molecules and running time in executing <code>B3clf</code> calculations | 14 |

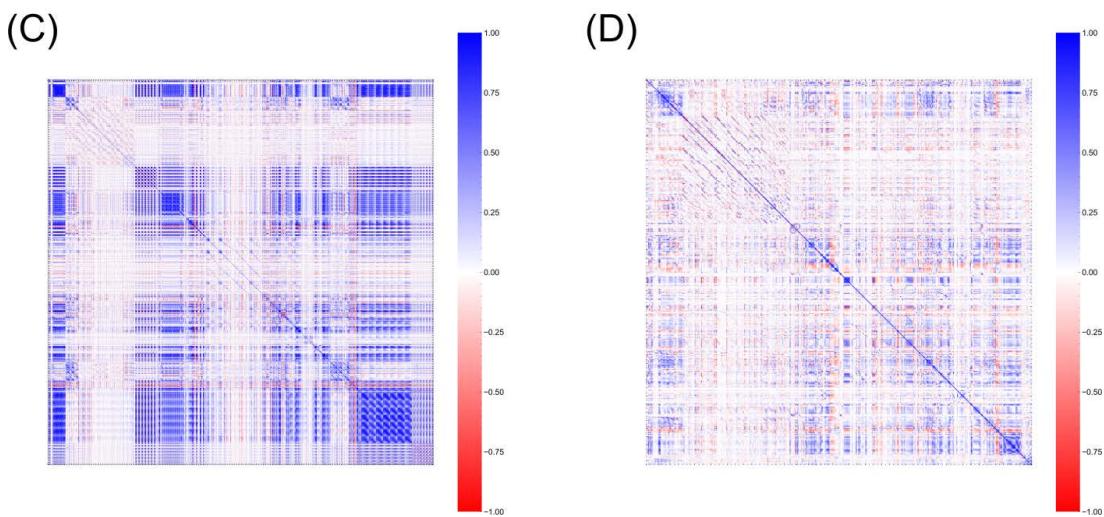
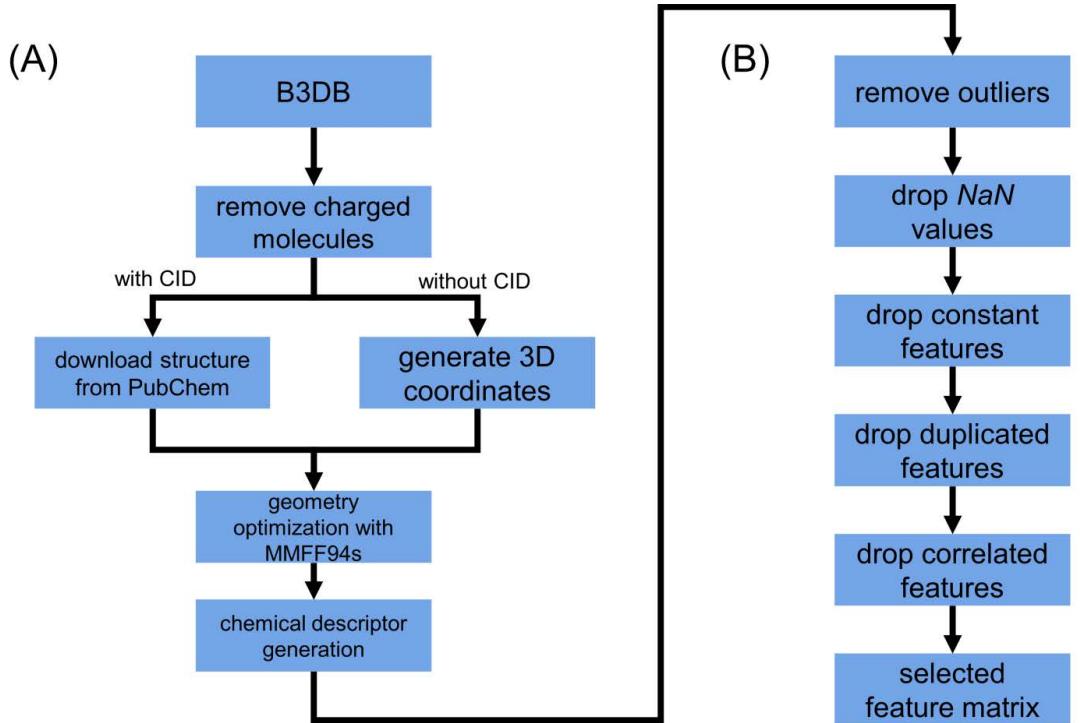


Fig. SI. 1 Workflow for (A) dataset preparation, (B) molecular feature generation, (C) and (D) feature filtering

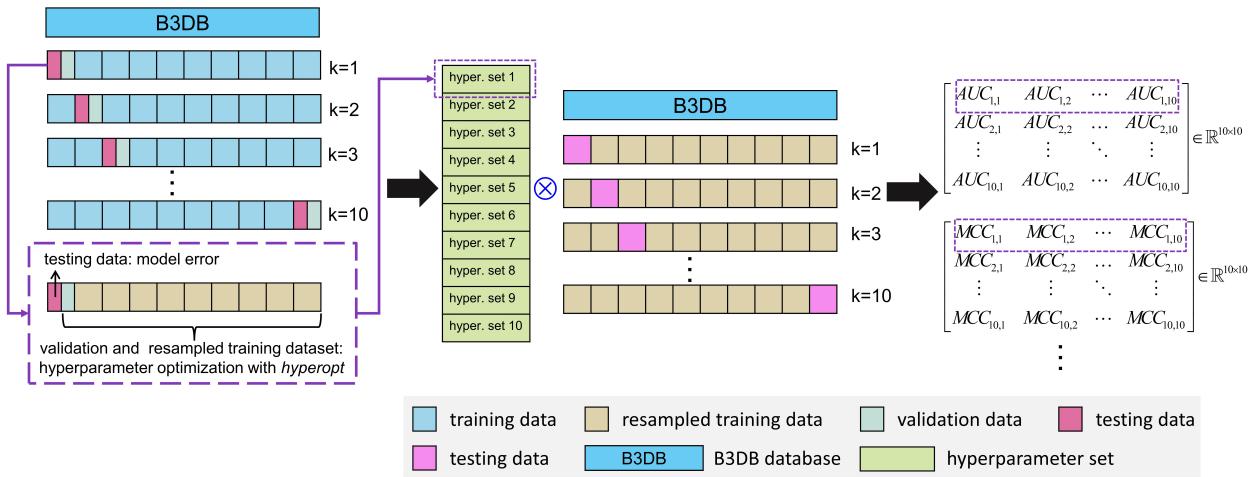


Fig. SI. 2 Two-stage stratified 10-fold cross-validation workflow for hyperparameter selection and model evaluation

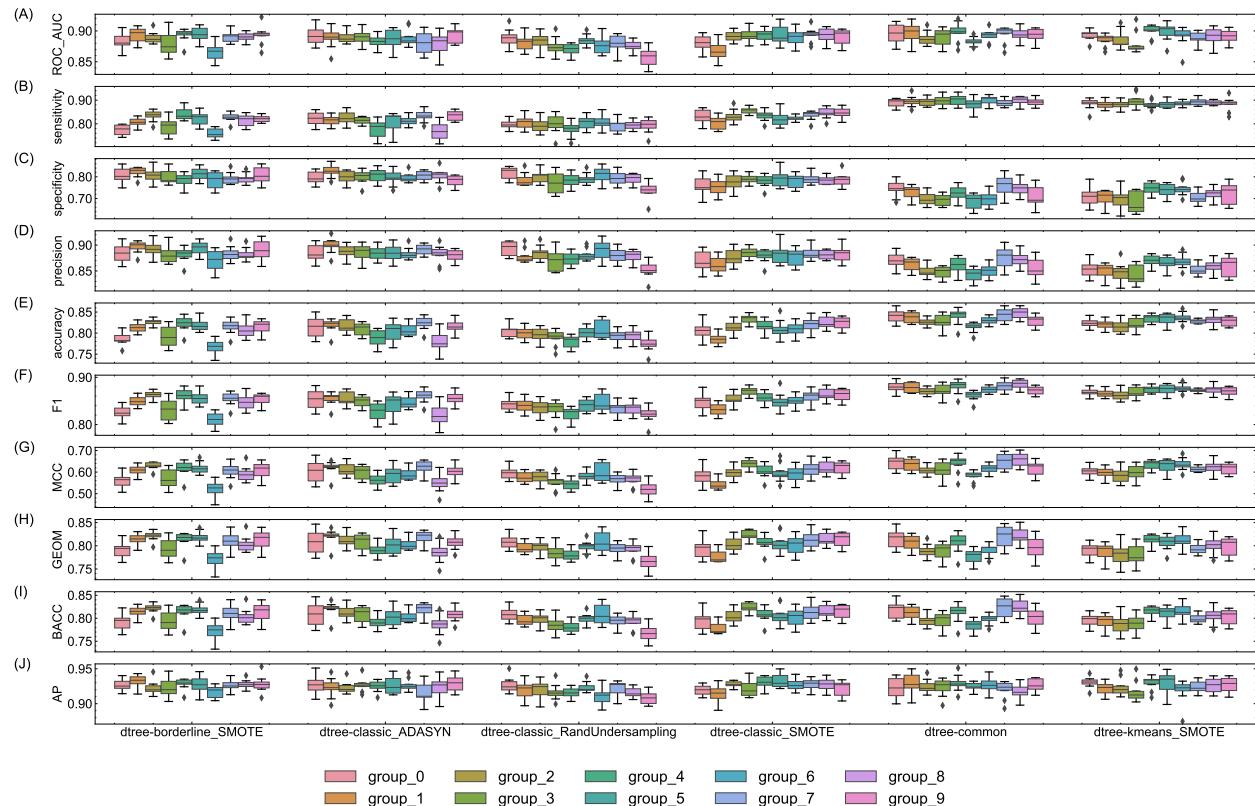


Fig. SI. 3 Model performances of decision trees based classifiers for 10 groups of hyperparameters

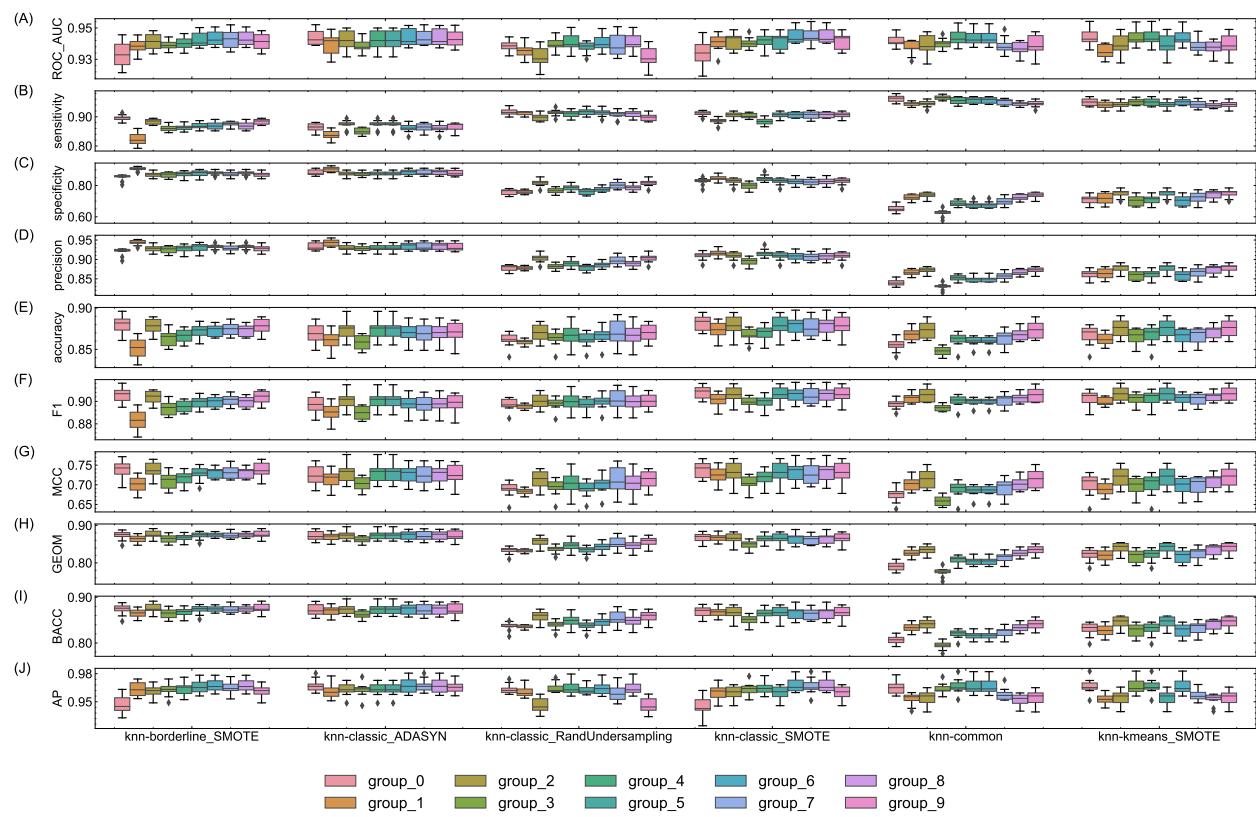


Fig. SI. 4 Model performances of kNN based classifiers for 10 groups of hyperparameters

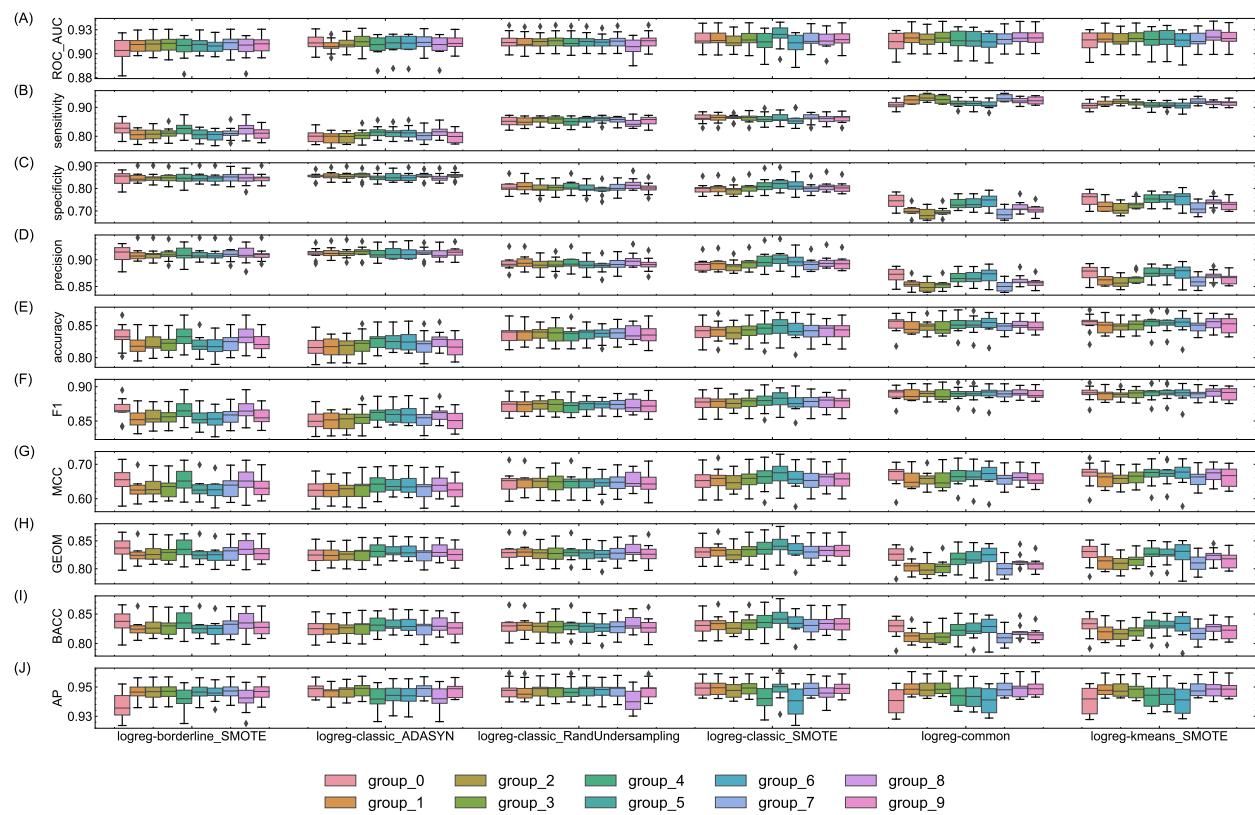


Fig. SI. 5 Model performances of logistical regression based classifiers for 10 groups of hyperparameters

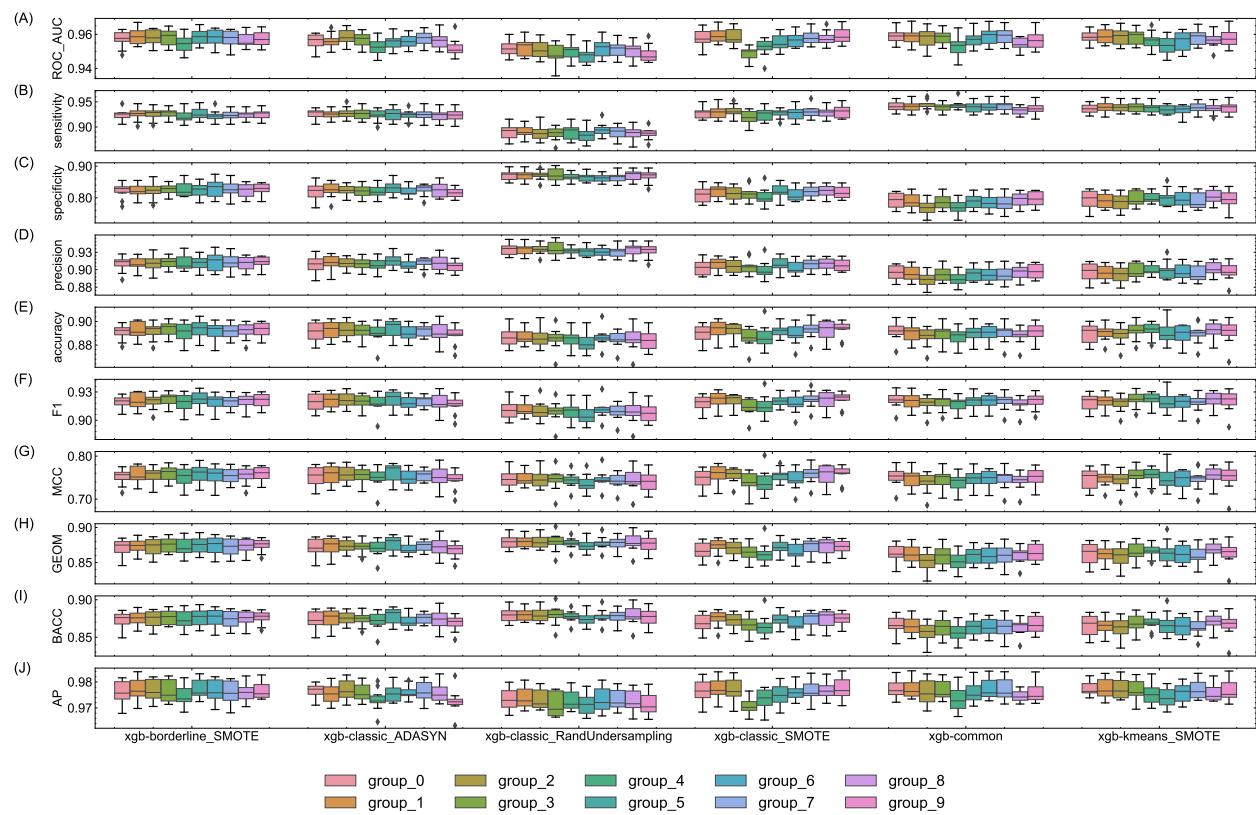


Fig. SI. 6 Model performances of XGBoost based classifiers for 10 groups of hyperparameters

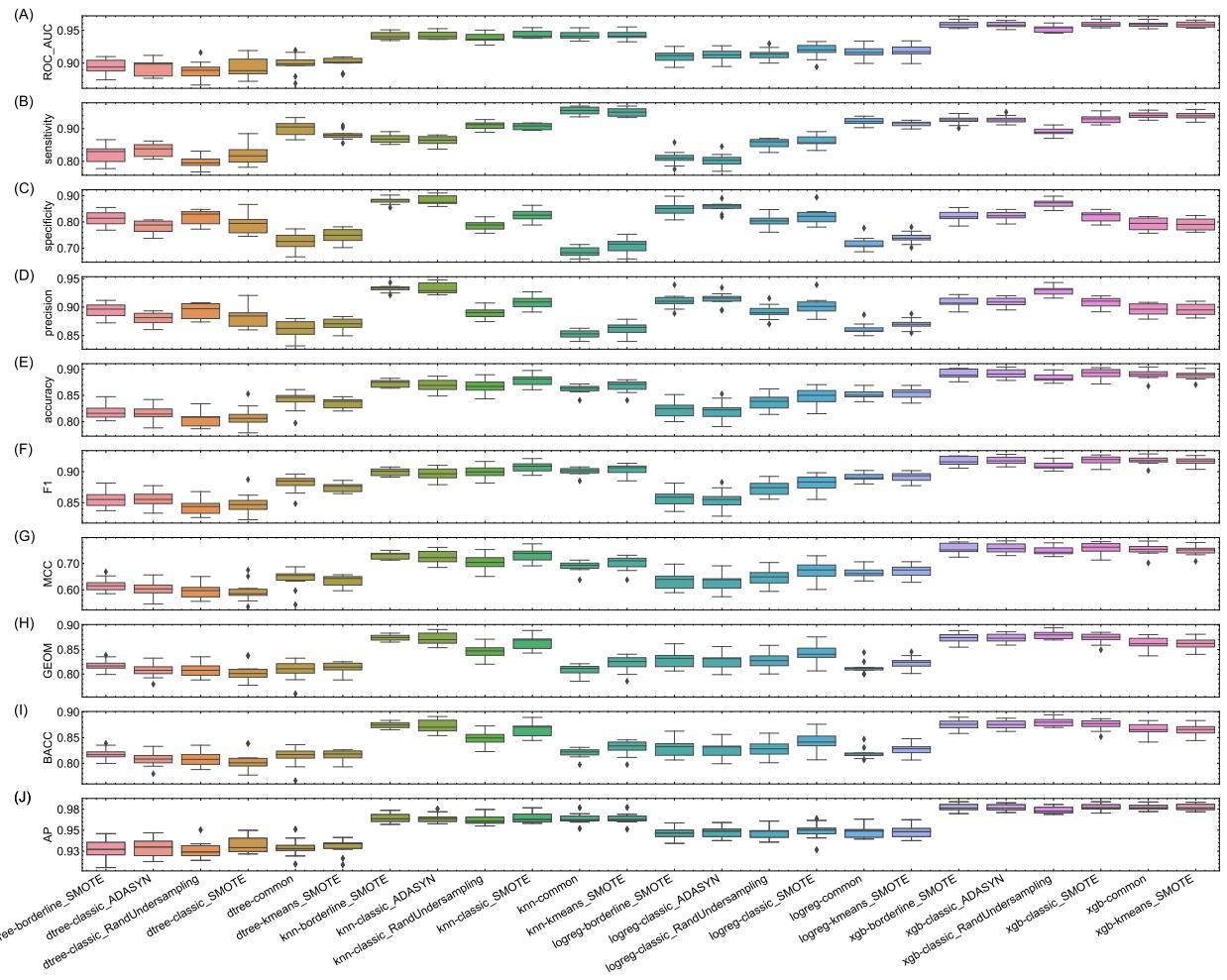


Fig. SI. 7 Summary of model performance across all classification model–sampling strategy combinations

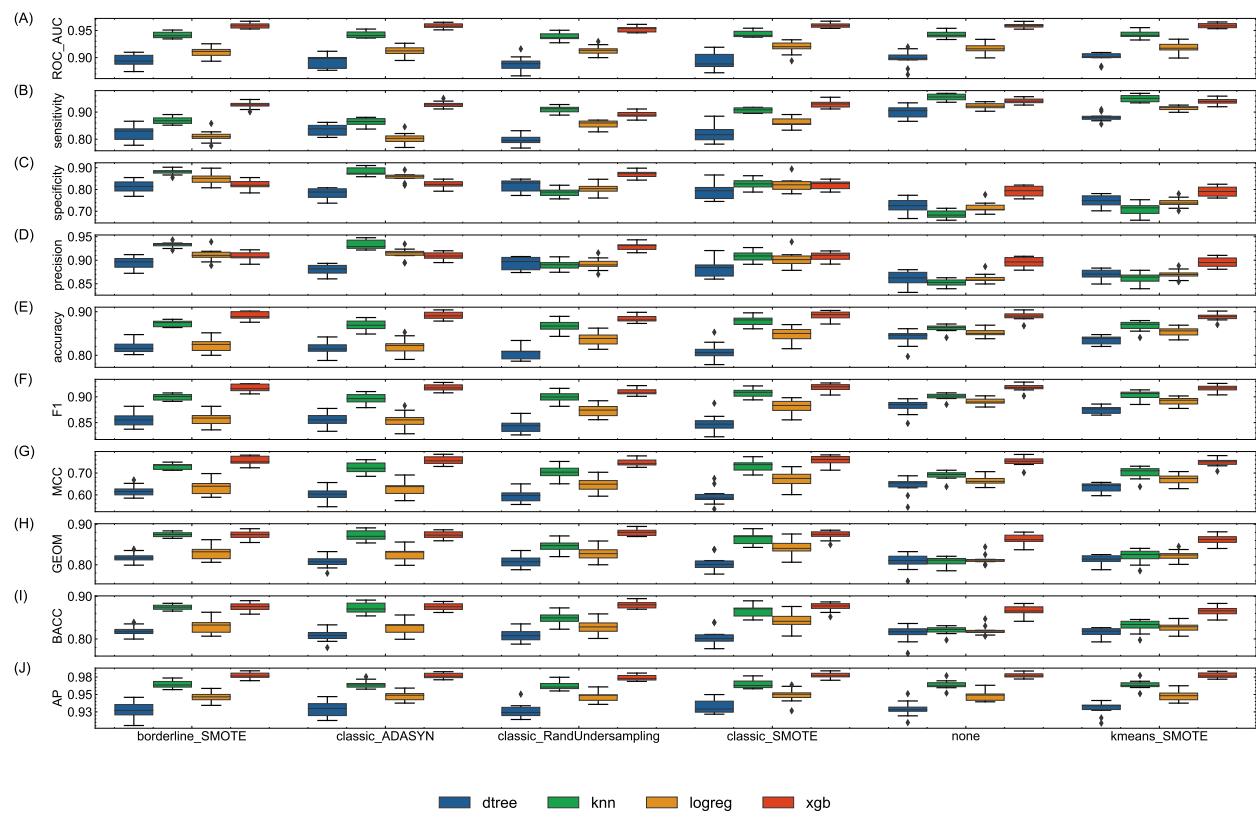


Fig. SI. 8 Summary of model performance across all classification model–sampling strategy combinations, organized by sampling strategies

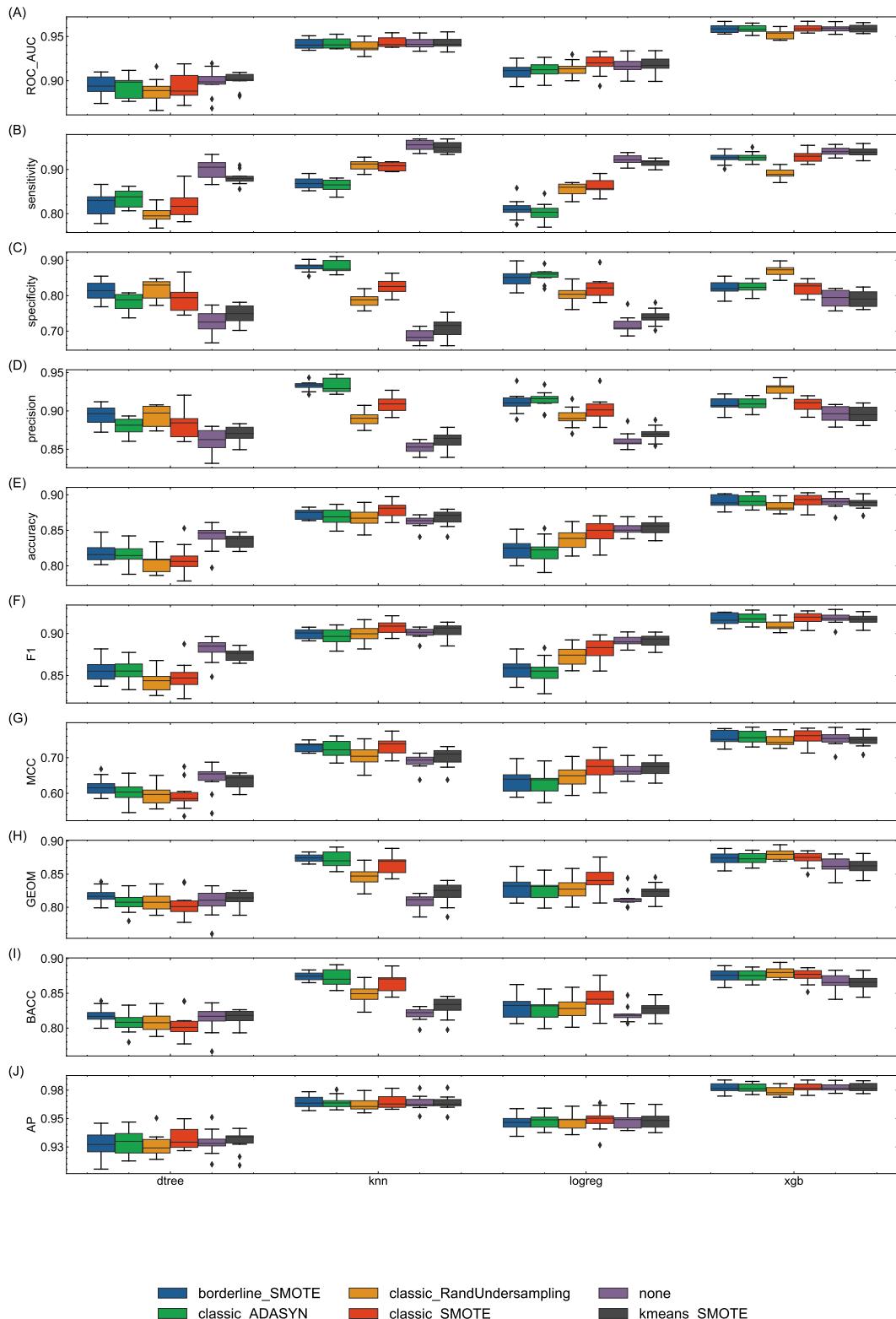


Fig. SI. 9 Summary of model performance across all classification model–sampling strategy combinations, organized by classification algorithms

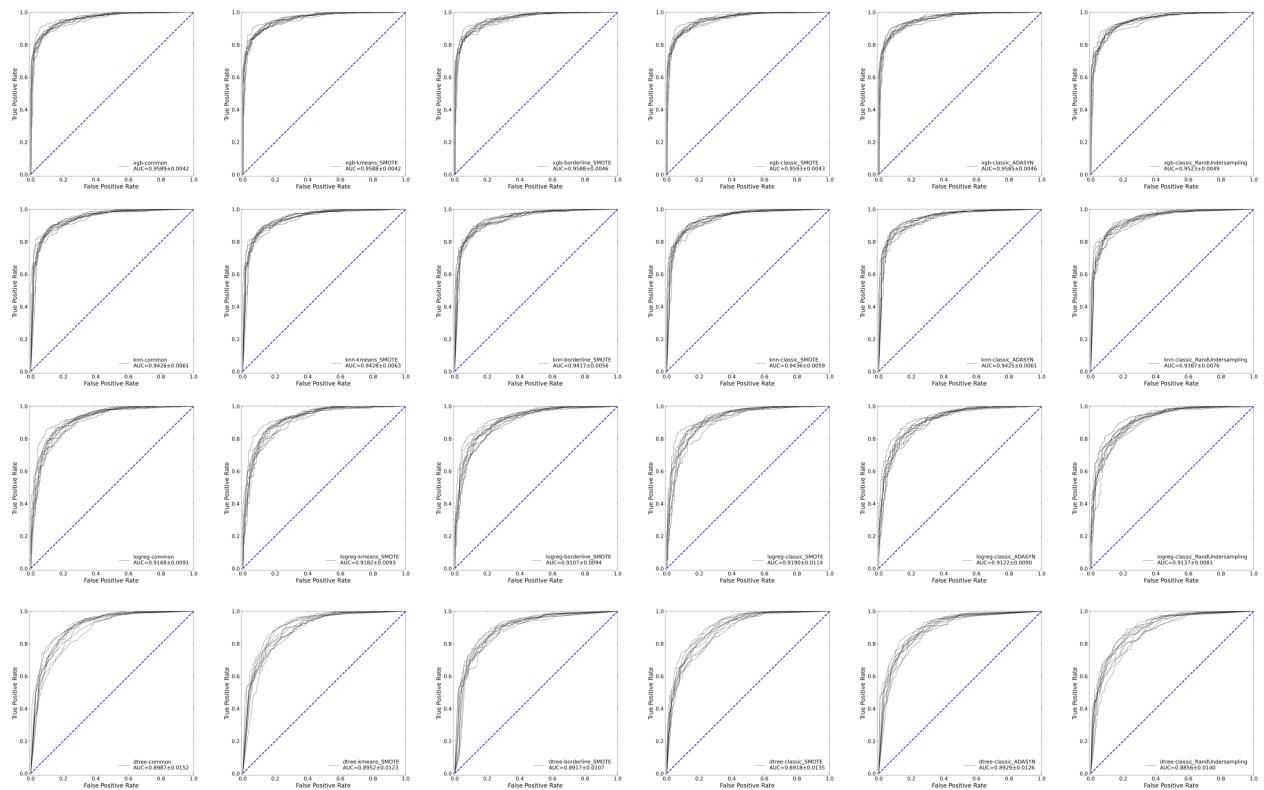


Fig. SI. 10 Receiver operating characteristic (ROC) curves of all classification model-sampling strategy combinations

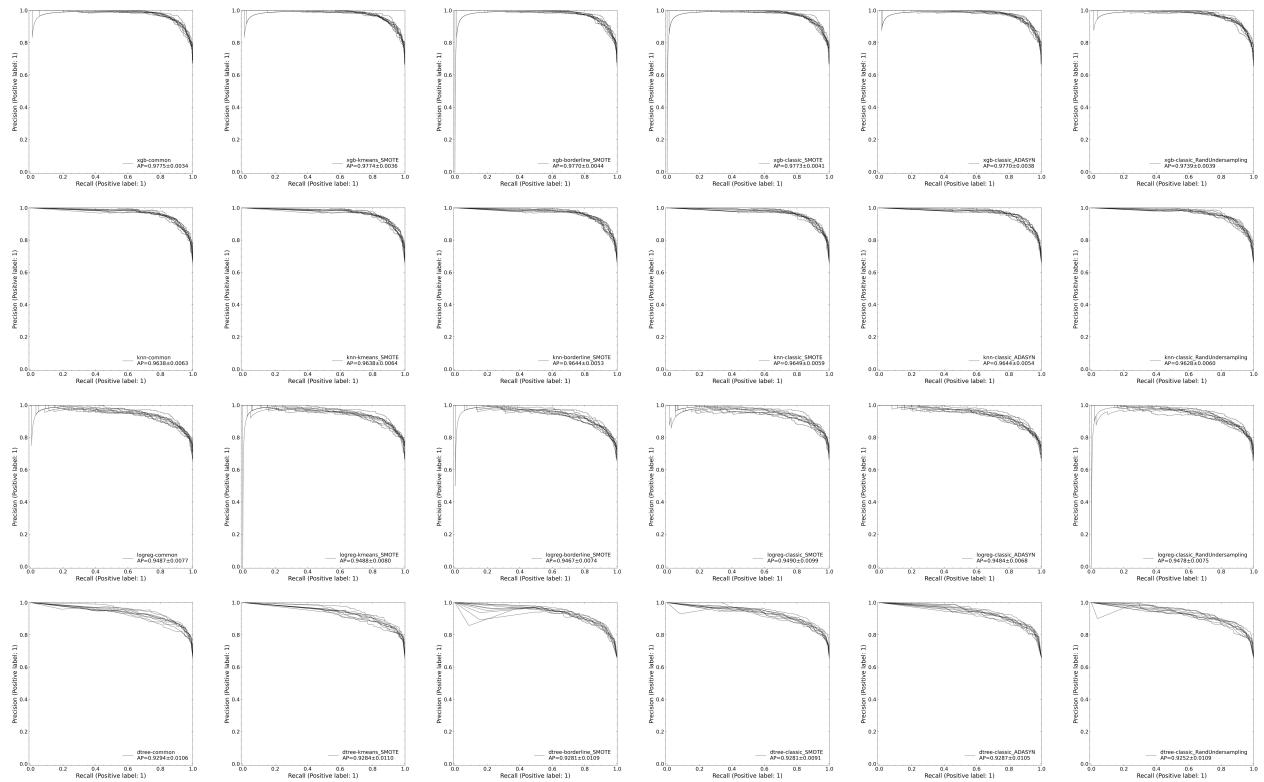


Fig. SI. 11 Precision-recall curves of all classification model–sampling strategy combinations

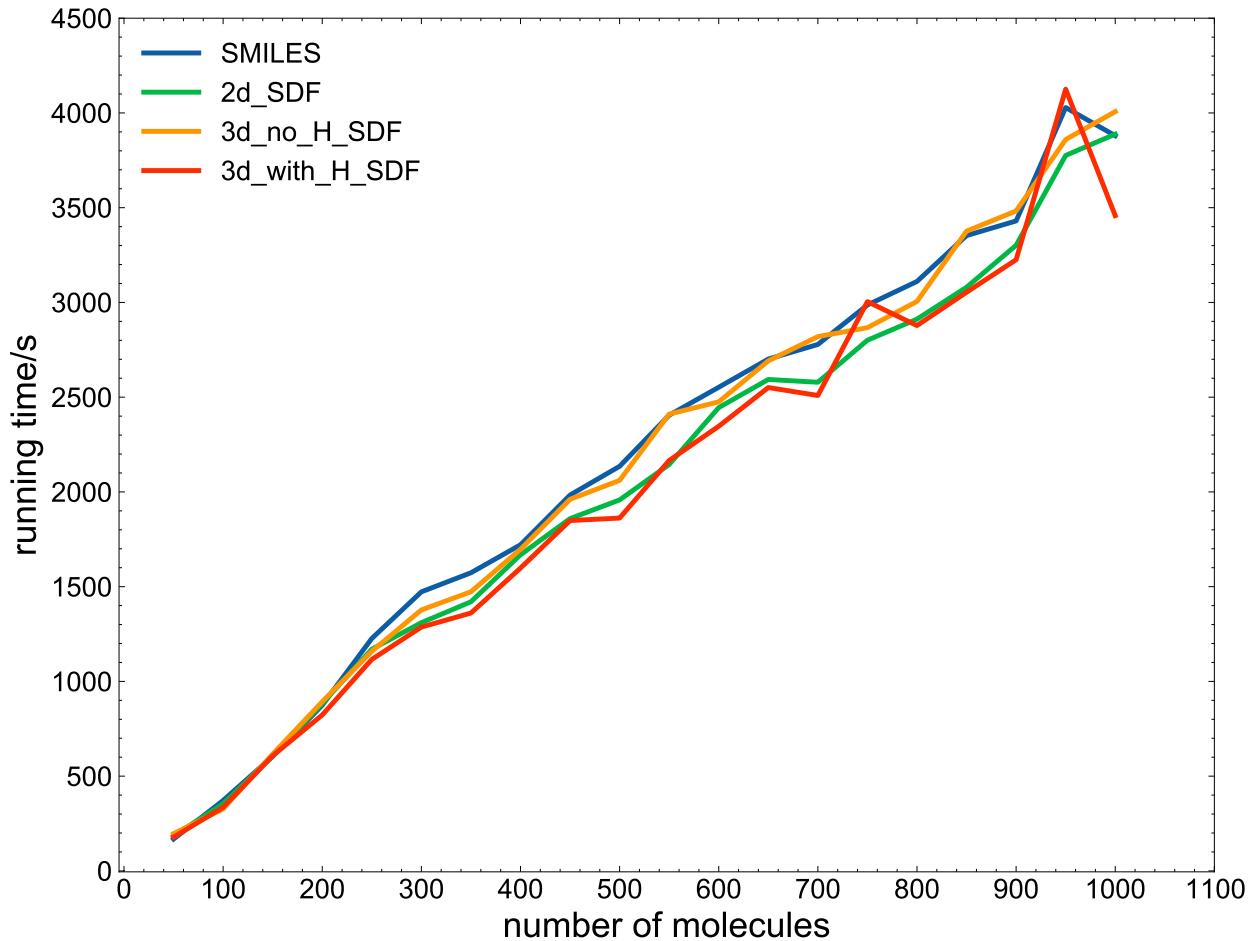


Fig. SI. 12 Relationship between number of molecules and running time in executing B3clf calculations

Table SI. 1 External dataset with compound identifiers and BBB permeability labels. For the most updated version of the extended B3DB dataset, please refer to <https://github.com/theochem/B3DB>.

| Compound Name | SMILES | CID | Class |
|--|---|----------|-------|
| (3S)-3-acetyloxy-4-(trimethylazaniumyl)butanoate | CC(=O)O[C@@H](CC(=O)[O-])C[N+](C)(C)C | 18230 | BBB+ |
| N-[2-(5-methoxy-1H-indol-3-yl)ethyl]acetamide | COc1ccc2[nH]cc(CCNC(C)=O)c2c1 | 896 | BBB+ |
| (2S)-2-acetamido-4-methylpentanoic acid | CC(=O)N[C@@H](CC(C)C)C(=O)O | 70912 | BBB+ |
| adamantan-1-amine | N[C@]12C[C@H]3C[C@H](C[C@H](C3)C1)C2 | 2130 | BBB+ |
| 4-amino-N-[(2R)-1-ethylpyrrolidin-2-yl]methyl]-5-ethylsulfonyl-2-methoxybenzamide | CCN1CCC[C@H]1CNC(=O)c1cc(S(=O)(=O)CC)c(N)cc1OC | 5746246 | BBB+ |
| (1S)-1-[(1R,2R,4R)-2-bicyclo[2.2.1]hept-5-enyl]-1-phenyl-3-piperidin-1-ylpropan-1-ol | O[C@](CCN1CCCCC1)(c1ccccc1)[C@H]1C[C@H]2C=C[C@H]1C2 | 12149109 | BBB+ |
| (2S)-1-butyl-N-(2,6-dimethylphenyl)piperidine-2-carboxamide | CCCCN1CCCC[C@H]1C(=O)Nc1c(C)cccc1C | 92253 | BBB+ |

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Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|--|----------|-------|
| (2R,5S)-2-methylspiro[1,3-oxathiolane-5,3'-1-azabicyclo[2.2.2]octane] | C[C@@H]1O[C@]2(CS1)CN1C CC2CC1 | 11041760 | BBB+ |
| 7-chloro-4-hydroxy-N-methyl-5-phenyl-3H-1,4-benzodiazepin-2-imine | C/N=C1/CN(O)C(c2ccccc2)=c 2cc(Cl)ccc2=N1 | 2712 | BBB+ |
| (11bS)-10-chloro-11b-(2-chlorophenyl)-2,3,5,7-tetrahydro-[1,3]oxazolo[3,2-d][1,4]benzodiazepin-6-one | O=C1CN2CCO[C@]2(c2ccccc2 Cl)c2cc(Cl)ccc2N1 | 25271643 | BBB+ |
| 5-(2,4-difluorophenyl)-2-hydroxybenzoic acid | O=C(O)c1cc(-c2ccc(F)cc2F)ccc 1O | 3059 | BBB+ |
| 10-[(2R)-2-(dimethylamino)propyl]-N,N-dimethylphenothiazine-2-sulfonamide | C[C@H](CN1c2ccccc2Sc2ccc(S(=O)(=O)N(C)Cc21)N(C)C | 76960728 | BBB+ |
| diethylcarbamothioylsulfanyl N,N-diethylcarbamodithioate | CCN(CC)C(=S)SSC(=S)N(CC CC | 3117 | BBB+ |
| (2R)-N-ethyl-1-[3-(trifluoromethyl)phenyl]propan-2-amine | CCN[C@H](C)Cc1cccc(C(F)(F) F)c1 | 65801 | BBB+ |
| [(2R)-2,3-dihydroxypropyl] 2-[[8-(trifluoromethyl)quinolin-4-yl]amino]benzoate | O=C(OC[C@H](O)CO)c1ccccc 1Nc1ccnc2c(C(F)(F)F)cccc12 | 76958517 | BBB+ |

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Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| [(2R)-2,3-dihydroxypropyl] 2-[(7-chloroquinolin-4-yl)amino]benzoate | O=C(OC[C@H](O)CO)c1ccccc1Nc1ccnc2cc(Cl)ccc12 | 969495 | BBB+ |
| N-methyl-3-(1-tetracyclo[6.6.2.02,7.09,14]hexadeca-2,4,6,9,11,13-hexaenyl)propan-1-amine | CNCCCC[C@]12CC[C@H](c3ccc3c1)cc1cccc12 | 4011 | BBB+ |
| [(1R,3R,5R)-6,6,9-trimethyl-9-azabicyclo[3.3.1]nonan-3-yl] 2-hydroxy-2,2-dithiophen-2-ylacetate | CN1[C@@H]2CCC(C)(C)[C@H]1C[C@H](OC(=O)C(O)(c1cccs1)c1cccs1)C2 | 68667 | BBB+ |
| (3S,5R)-3,5-dimethyladamantan-1-amine | C[C@]12C[C@@H]3C[C@](C)(C1)C[C@H](N)(C3)C2 | 1263681 | BBB+ |
| (2R)-N-(2,6-dimethylphenyl)-1-methylpiperidine-2-carboxamide | Cc1ccccc1Cc1NC(=O)[C@H]1C1CCCN1C | 6918904 | BBB+ |
| (6R)-6-(dimethylamino)-4,4-diphenylheptan-3-one | CCC(=O)C(C[C@@H](C)N(C)C)(c1ccccc1)c1ccccc1 | 22267 | BBB+ |
| (3R)-1-methyl-3-(9H-thioxanthen-9-ylmethyl)piperidine | CN1CCC[C@H](CC2c3ccccc3Sc3ccccc32)C1 | 44163540 | BBB+ |

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| Compound Name | SMILES | CID | Class |
|---|--|----------|-------|
| 2-[(S)-benzhydrylsulfinyl]acetamide | NC(=O)C[S@](=O)C(c1ccccc1)c1ccccc1 | 11173366 | BBB+ |
| (8aR)-1'-[3-(2-chloro-5,6-dihydrobenzo[b][1]benzazepin-11-yl)propyl]spiro[1,5,6,7,8,8a-hexahydroimidazo[1,2-a]pyridine-3,4'-piperidine]-2-one | O=C1N[C@H]2CCCCN2C12CCN(CCCN1c3cccc3CCc3ccc(Cl)c31)CC2 | 12831242 | BBB+ |
| [3-(dimethylcarbamoyloxy)phenyl]-trimethylazanium | CN(C)C(=O)Oc1cccc([N+](C)(C)C)c1 | 4456 | BBB+ |
| N-(1,5-dimethyl-3-oxo-2-phenylpyrazol-4-yl)pyridine-3-carboxamide | Cc1c(NC(=O)c2cccnc2)c(=O)n(-c2cccc2)n1C | 4487 | BBB+ |
| N-(4-ethoxyphenyl)acetamide | CCOc1ccc(NC(C)=O)cc1 | 4754 | BBB+ |
| (2R)-N-(2-methylphenyl)-2-(propylamino)propanamide | CCCN[C@H](C)C(=O)Nc1cccc1 | 12444990 | BBB+ |
| 3-methyl-1-(5-oxohexyl)-7-propylpurine-2,6-dione | CCCN1cnc2c1c(=O)n(CCCCC(C)=O)c(=O)n2C | 4938 | BBB+ |
| (1-methylpyridin-1-i um-3-yl) N,N-dimethylcarbamate | CN(C)C(=O)Oc1ccc[n+](C)c1 | 4991 | BBB+ |
| 2-hydroxybenzamide | NC(=O)c1ccccc1O | 5147 | BBB+ |

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| Compound Name | SMILES | CID | Class |
|--|---|----------|-------|
| 2-(2-hydroxybenzoyl)oxybenzoic acid | O=C(Oc1ccccc1C(=O)O)c1cccc1O | 5161 | BBB+ |
| [(1R,2R,4S,5S)-9-methyl-3-oxa-9-azatricyclo[3.3.1.02,4]nonan-7-yl] (2R)-3-hydroxy-2-phenylpropanoate | CN1[C@@H]2C[C@H](OC(=O)[C@@H](CO)c3ccccc3)C[C@H]1[C@@H]1O[C@@H]12 | 673473 | BBB+ |
| 2-(dimethylamino)ethyl 4-(butylamino)benzoate | CCCCNc1ccc(C(=O)OCCN(C)C)cc1 | 5411 | BBB+ |
| 2,2,2-trichloroethyl dihydrogen phosphate | O=P(O)(O)OCC(Cl)(Cl)Cl | 5563 | BBB+ |
| (1R)-1-cyclohexyl-1-phenyl-3-piperidin-1-ylpropan-1-ol | O[C@@](CCN1CCCCCC1)(c1ccc1C1)C1CCCCC1 | 207843 | BBB+ |
| (3S,4R)-3-ethyl-4-[(3-methylimidazol-4-yl)methyl]oxolan-2-one | CC[C@@H]1C(=O)OC[C@@H]1Cc1cnncn1C | 5910 | BBB+ |
| pyridine-3,4-diamine | Nc1ccncc1N | 5918 | BBB+ |
| [(3R)-2-(carbamoyloxymethyl)-2,3-dimethylpentyl] carbamate | CC[C@@H](C)C(C)(COc1ccccc1)OC(=O)=O | 57066553 | BBB+ |
| (2S)-2-aminobutanoic acid | CC[C@H](N)C(=O)O | 80283 | BBB+ |

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| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| (5S)-5-ethyl-3,5-dimethyl-1,3-oxazolidine-2,4-dione | CC[C@]1(C)OC(=O)N(C)C1=O | 51380896 | BBB+ |
| 2-(diethylamino)ethyl 4-amino-2-chlorobenzoate | CCN(CC)CCOC(=O)c1ccc(N)cc1Cl | 8612 | BBB+ |
| (5R)-5-[(2S)-hex-3-yn-2-yl]-1-methyl-5-prop-2-enyl-1,3-diazinane-2,4,6-trione | C=CC[C@@]1([C@@H](C)C#CCC)C(=O)NC(=O)N(C)C1=O | 51397655 | BBB+ |
| (6aR,9R)-N-[(2S)-1-hydroxybutan-2-yl]-4,7-dimethyl-6,6a,8,9-tetrahydroindolo[4,3-fg]quinoline-9-carboxamide | CC[C@@H](CO)NC(=O)[C@H]1C=C2c3cccc4c3c(cn4C)C[C@H]2N(C)C1 | 9681 | BBB+ |
| (1R,9S)-7,11-diazatricyclo[7.3.1.02,7]trideca-2,4-dien-6-one | O=c1cccc2n1C[C@@H]1CNC[C@H]2C1 | 10235 | BBB+ |
| 2-[(R)-(4-butylsulfanylphenyl)-phenylmethyl]sulfanyl-N,N-dimethylethanamine | CCCCSc1ccc([C@H](SCCN(C)Cc2cccc2)C)cc1 | 76959957 | BBB+ |
| 3-ethyl-5,5-dimethyl-1,3-oxazolidine-2,4-dione | CCN1C(=O)OC(C)(C)C1=O | 10630 | BBB+ |
| (2S)-N-carbamoyl-2-propan-2-ylpent-4-enamide | C=CC[C@H](C(=O)NC(N)=O)C(C)C | 76961142 | BBB+ |

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| Compound Name | SMILES | CID | Class |
|--|--|----------|-------|
| 2-(2-methylpropylamino)ethyl 3-aminobenzoate | CC(C)CNCCOC(=O)c1cccc(N)c1 | 11115 | BBB+ |
| ethyl 1-[(3S)-3-hydroxy-3-phenylpropyl]-4-phenylpiperidine-4-carboxylate | CCOC(=O)C1(c2ccccc2)CCN(CC[C@H](O)c2ccccc2)C1 | 92215562 | BBB+ |
| [(2R,3S,4R,5R)-5-(4-amino-2-oxopyrimidin-1-yl)-3,4-dihydroxyxolan-2-yl]methoxy-hydroxyphosphoryl] 2-(trimethylazaniumyl)ethyl phosphate | C[N+](C)(C)CCO[P@](=O)([O-])O[P@@](=O)(O)OC[C@H]1O[C@H](n2ccc(N)nc2=O)[C@H](O)[C@@H]1O | 13804 | BBB+ |
| 2-[[[(2R,3S,4R,5R)-5-(4-amino-2-oxopyrimidin-1-yl)-3,4-dihydroxyxolan-2-yl]methoxy-hydroxyphosphoryl]oxy-hydroxyphosphoryl]oxyethyl-trimethylazanium | C[N+](C)(C)CCO[P@@](=O)(O)O[C@H]1O[C@H](n2ccc(N)nc2=O)[C@H](O)[C@@H]1O | 13805 | BBB+ |
| (3R)-4-amino-3-phenylbutanoic acid | NC[C@H](CC(=O)O)c1ccccc1 | 685622 | BBB+ |
| (3R)-N-(4-ethoxyphenyl)-3-hydroxybutanamide | CCOc1ccc(NC(=O)C[C@H](C)O)cc1 | 6918884 | BBB+ |

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| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| (1S,2S,3R,4R)-N-ethyl-3-phenylbicyclo[2.2.1]heptan-2-amine | CCN[C@H]1[C@H]2CC[C@H] (C2)[C@@H]1c1ccccc1 | 76960649 | BBB+ |
| (1S,9S,13S)-1,13-dimethyl-10-(2-phenylethyl)-10-azatricyclo[7.3.1.0 ^{2,7}]trideca-2(7),3,5-trien-4-ol | C[C@@H]1[C@@H]2Cc3ccc(O)cc3[C@@]1(C)CCN2CCc1cccc1 | 3048356 | BBB+ |
| 2-[2-[4-[(2R)-2-methyl-3-phenothiazin-10-ylpropyl]piperazin-1-yl]ethoxy]ethanol | C[C@H](CN1CCN(CCOCCO)CC1)CN1c2ccccc2Sc2ccccc21 | 9932302 | BBB+ |
| 5-[(2R)-2-hydroxypropyl]-5-prop-2-enyl-1,3-diazinane-2,4,6-trione | C=CCC1(C[C@@H](C)O)C(=O)NC(=O)NC1=O | 76968709 | BBB+ |
| (5S)-5-(2-bromoprop-2-enyl)-1-methyl-5-propan-2-yl-1,3-diazinane-2,4,6-trione | C=C(Br)C[C@]1(C(C)C)C(=O)NC(=O)N(C)C1=O | 76963951 | BBB+ |
| 5-[(1R,5S)-3-bicyclo[3.2.1]oct-2-enyl]-5-ethyl-1,3-diazinane-2,4,6-trione | CCC1(C2=C[C@@H]3CC[C@H](C2)C3)C(=O)NC(=O)NC1=O | 71307002 | BBB+ |
| 1,3-dimethyl-7-[2-[(2R)-1-phenylpropan-2-yl]amino]ethyl]purine-2,6-dione | C[C@H](Cc1ccccc1)NCCn1cnc2c1c(=O)n(C)c(=O)n2C | 25271663 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|--|----------|-------|
| (2R,3R)-2-ethyl-3-methylpentanamide | CC[C@H](C)[C@H](CC)C(=O)=O | 36689722 | BBB+ |
| (4-acetamidophenyl) 2-acetoxybenzoate | CC(=O)Nc1ccc(OC(=O)c2cccc2OC(=O)cc1 | 21102 | BBB+ |
| (2R)-N,N,2-trimethyl-3-(2-tricyclo[9.4.0.03,8]pentadeca-1(15),3,5,7,11,13-hexaenyl)propan-1-amine | C[C@H](CC1c2cccc2CCc2cccc21)CN(C)C | 36690126 | BBB+ |
| 2-(butylamino)-N-(2-chloro-6-methylphenyl)acetamide | CCCCNCC(=O)Nc1c(C)cccc1Cl | 22379 | BBB+ |
| methyl (2S)-2-amino-3-(3,4-dihydroxyphenyl)propanoate | COc1ccc(O)c(O)c1 | 23497 | BBB+ |
| (1S,2R)-2-phenylcyclopropan-1-amine | N[C@H]1C[C@H]1c1cccc1 | 26070 | BBB+ |
| N-methyl-1-(1-tetracyclo[6.6.2.02,7.09,14]hexadeca-2,4,6,9,11,13-hexaenyl)methanamine | CNC[C@H]12CC[C@H](c3cccc31)c1cccc12 | 28425 | BBB+ |
| 3-(diethylamino)propyl (1S,2S,4R)-2-phenylbicyclo[2.2.1]heptane-2-carboxylate | CCN(CC)CCCOc1ccc(cc1)C[C@H]2CC[C@H]1C2 | 76965001 | BBB+ |

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| Compound Name | SMILES | CID | Class |
|--|--|----------|-------|
| 2-[(1R)-1-(2,6-dichlorophenoxy)ethyl]-4,5-dihydro-1H-imidazole | C[C@@H](Oc1c(Cl)cccc1Cl)C1=NCCN1 | 3038503 | BBB+ |
| (3S)-3-(1-benzylpiperidin-4-yl)-3-phenylpiperidine-2,6-dione | O=C1CC[C@@](c2ccccc2)(C2=CCN(Cc3ccccc3)CC2)C(=O)N1 | 30843 | BBB+ |
| 2,4,6-trimethyl-1,3,5-trioxane | C[C@H]1O[C@@H](C)O[C@H](C)O1 | 31264 | BBB+ |
| methyl 4-methyl-3-[(2S)-2-(propylamino)propanoyl]amino]thiophene-2-carboxylate | CCCN[C@@H](C)C(=O)Nc1c(C)csc1C(=O)OC | 6604377 | BBB+ |
| 3-(12H-[1]benzofuro[3,2-c][1]benzoxepin-6-ylidene)-N,N-dimethylpropan-1-amine | CN(C)CCC=C1c2ccccc2OCc2c1oc1ccccc21 | 36846 | BBB+ |
| (2S)-N-(2,6-dimethylphenyl)-2-[ethyl(propyl)amino]butanamide | CCCN(CC)[C@@H](CC)C(=O)Nc1c(C)cccc1C | 12862484 | BBB+ |
| (3R)-7-chloro-5-(2-fluorophenyl)-3-hydroxy-1-(2-hydroxyethyl)-3H-1,4-benzodiazepin-2-one | O=C1[C@@H](O)N=C(c2cccc2F)c2cc(Cl)ccc2N1CCO | 76967234 | BBB+ |
| 4-[(4-chlorophenyl)-(5-fluoro-2-hydroxyphenyl)methylidene]amino]butanamide | NC(=O)CCC/N=C(\c1ccc(Cl)cc1)c1cc(F)ccc1O | 44115 | BBB+ |

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Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|--|-----------|-------|
| 5-ethyl-5-prop-2-enyl-1,3-diazinane-2,4,6-trione | C=CCC1(CC)C(=O)NC(=O)NC1=O | 48542 | BBB+ |
| (6S)-6-[propyl(2-thiophen-2-ylethyl)amino]-5,6,7,8-tetrahydronaphthalen-1-ol | CCCN(CCc1cccs1)[C@H]1CCc2c(O)cccc2C1 | 59227 | BBB+ |
| 4-[4-(2-oxo-3-propanoylbenzimidazol-1-yl)piperidin-1-yl]-2,2-diphenylbutanenitrile | CCC(=O)n1c(=O)n(C2CCN(CC(C#N)(c3cccc3)c3cccc3)CC2)c2cccc21 | 61791 | BBB+ |
| [<i>(3S</i>)-3,6-dihydroxy-1-propan-2-yl-2,3-dihydroindol-5-yl]iminourea | CC(C)N1C[C@@H](O)c2cc(/N=N/C(N)=O)c(O)cc21 | 135565885 | BBB+ |
| (1 <i>S</i>)-2-[bis[(2 <i>R</i>)-butan-2-yl]amino]-1-[1-[(2-chlorophenyl)methyl]pyrrol-2-yl]ethanol | CC[C@@H](C)N(C[C@H](O)c1ccn1Cc1cccc1Cl)[C@H](C)C | 76961195 | BBB+ |
| 3-(2-chlorophenothiazin-10-yl)-N,N-diethylpropan-1-amine | CCN(CC)CCCN1c2cccc2Sc2ccc(Cl)cc21 | 65750 | BBB+ |
| 2,3-diacetyloxybenzoic acid | CC(=O)Oc1cccc(C(=O)O)c1OC(C)=O | 68093 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|--|----------|-------|
| (2-methoxyphenyl) 2-acetoxybenzoate | COc1ccccc1OC(=O)c1ccccc1OC(C)=O | 68749 | BBB+ |
| 3-acetamidopropane-1-sulfonic acid | CC(=O)NCCCS(=O)(=O)O | 71158 | BBB+ |
| N-[(2R)-4-[4-(4-fluorophenyl)piperazin-1-yl]butan-2-yl]pyridine-3-carboxamide | C[C@H](CCN1CCN(c2ccc(F)cc2)C1)NC(=O)c1cccncl | 76956128 | BBB+ |
| ethyl (6S)-1,6-dimethyl-4-oxo-6,7,8,9-tetrahydropyrido[1,2-a]pyrimidin-1-ium-3-carboxylate | CCOC(=O)c1c[n+](C)c2n(c1=O)[C@@H](C)CCC2 | 15584873 | BBB+ |
| (6R)-6-(methylamino)-6,7,8,9-tetrahydro-5H-carbazole-3-carboxamide | CN[C@@H]1CCc2[nH]c3ccc(C(=O)cc3c2C1) | 77992 | BBB+ |
| N-[2-(7-methoxynaphthalen-1-yl)ethyl]acetamide | COc1ccc2cccc(CCNC(C)=O)c2c1 | 82148 | BBB+ |
| (2R,5R)-2-methylspiro[1,3-oxathiolane-5,3'-1-azabicyclo[2.2.2]octane] | C[C@@H]1O[C@@]2(CS1)CN1CCCC2CC1 | 83898 | BBB+ |
| 11-[(3R)-1-azabicyclo[2.2.2]octan-3-yl]-5,6-dihydrobenzo[b][1]benzazepine | c1ccc2c(c1)CCc1ccccc1N2[C@H]1CN2CCC1CC2 | 76957954 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| (8S,10S,13S,14S,16R,17S)-17-[2-[4-(2,6-dipyrrolidin-1-ylpyrimidin-4-yl)piperazin-1-yl]acetyl]-10,13,16-trimethyl-6,7,8,12,14,15,16,17-octahydrocyclopenta[a]phenanthren-3-one | C[C@@H]1C[C@H]2[C@@H]3CCC4=CC(=O)C=C[C@]4(C)C3=CC[C@]2(C)[C@H]1C(=O)CN1CCN(c2cc(N3CCCC3)nc(N3CCCC3)n2)CC1 | 104903 | BBB+ |
| 1,3,4,6-tetramethyl-3a,6a-dihydroimidazo[4,5-d]imidazole-2,5-dione | CN1C(=O)N(C)[C@H]2[C@@H]1N(C)C(=O)N2C | 122282 | BBB+ |
| 4-[(1R)-2-(dimethylamino)-1-(1-hydroxycyclohexyl)ethyl]phenol | CN(C)C[C@@H](c1ccc(O)cc1)C1(O)CCCCCC1 | 12018336 | BBB+ |
| (2S)-2-[[4-[(3-fluorophenyl)methoxy]phenyl]methylamino]propanoic acid | C[C@H](NCc1ccc(Oc2ccccc(F)c2)cc1)C(=O)N | 131682 | BBB+ |
| [(1R,2R,4S,5S)-9-methyl-3-oxa-9-azatricyclo[3.3.1.02,4]nonan-7-yl] (2S)-3-hydroxy-2-phenylpropanoate | CN1[C@@H]2C[C@H](OC(=O)[C@H](CO)c3cccc3)C[C@H]1O[C@@H]12 | 3000322 | BBB+ |
| (1R,12S)-5,8,14-triazatetracyclo[10.3.1.02,11.04,9]hexadeca-2,4,6,8,10-pentaene | c1cnc2cc3c(cc2n1)[C@@H]1CNC[C@H]3C1 | 5310966 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|---|---------|-------|
| (2S)-N-(2,6-dimethylphenyl)-1-propylpiperidine-2-carboxamide | CCCN1CCCC[C@H]1C(=O)Nc1c(C)cccc1C | 175805 | BBB+ |
| (1S,5R)-3-(6H-benzo[c][1]benzothiepin-11-ylidene)-8-methyl-8-azabicyclo[3.2.1]octane | CN1[C@@H]2CC[C@H]1CC(=C1c3ccccc3CSc3ccccc31)C2 | 3034047 | BBB+ |
| (1S,2R,6S,7R)-4-[[[(1R,2R)-2-[[4-(1,2-benzothiazol-3-yl)piperazin-1-yl]methyl]cyclohexyl]methyl]-4-azatricyclo[5.2.1.02,6]decane-3,5-dione | O=C1[C@@H]2[C@H]3CC[C@H](C3)[C@@H](C2)C(=O)N1C [C@@H]1CCCC[C@H]1CN1CC N(c2nsc3ccccc23)CC1 | 213046 | BBB+ |
| (2R)-2-acetamido-N-benzyl-3-methoxypropanamide | CO[C@H](NC(=O)C(=O)NCC1cccc1)C | 219078 | BBB+ |
| (1R,9R,13R)-1,13-dimethyl-10-(2-phenylethyl)-10-azatricyclo[7.3.1.02,7]trideca-2(7),3,5-trien-4-ol | C[C@H]1[C@H]2Cc3ccc(O)cc3[C@]1(C)CCN2CCc1ccccc1 | 443405 | BBB+ |
| methyl (1R,2R,3S,5S)-3-benzyloxy-8-methyl-8-azabicyclo[3.2.1]octane-2-carboxylate | COC(=O)[C@H]1[C@@H](OC(=O)c2ccccc2)C[C@H]2CC[C@H]1N2C | 446220 | BBB+ |
| 2,3,5,6,7,8-hexahydro-1H-cyclopenta[b]quinolin-9-amine | Nc1c2c(nc3c1CCC3)CCCC2 | 604519 | BBB+ |

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Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|---|----------|-------|
| [(1S,2R,4S,5R)-9-methyl-3-oxa-9-azatricyclo[3.3.1.02,4]nonan-7-yl] (2R)-3-hydroxy-2-phenylpropanoate | CN1[C@@H]2C[C@H](OC(=O)[C@@H](CO)c3ccccc3)C[C@H]1O[C@H]12 | 638340 | BBB+ |
| 2-[(1R,6R)-3-methyl-6-prop-1-en-2-ylcyclohex-2-en-1-yl]-5-pentylbenzene-1,3-diol | C=C(C)[C@@H]1CCC(C)=C[C@H]1c1c(O)cc(CCCCC)cc1O | 644019 | BBB+ |
| [(2R)-2,3-dihydroxypropyl] 2-(trimethylazaniumyl)ethyl phosphate | C[N+](C)(C)CCO[P@](=O)([O-])OC[C@H](O)CO | 657272 | BBB+ |
| (1S,9R)-7,11-diazatricyclo[7.3.1.02,7]trideca-2,4-dien-6-one | O=c1cccc2n1C[C@H]1CNC[C@@H]2C1 | 683511 | BBB+ |
| (1S,5R)-3-benzhydryloxy-8-methyl-8-azabicyclo[3.2.1]octane | CN1[C@@H]2CC[C@H]1C[C@H](OC(c1ccccc1)c1ccccc1)C2 | 1201549 | BBB+ |
| 2-[(R)-benzhydrylsulfinyl]-N-hydroxyacetamide | O=C(C[S@H](=O)C(c1ccccc1)c1ccccc1)NO | 25271624 | BBB+ |
| (2R,6R)-9-chloro-4-methyl-13-oxa-4-azatetracyclo[12.4.0.02,6.07,12]octadeca-1(18),7(12),8,10,14,16-hexaene | CN1C[C@H]2c3ccccc3Oc3ccc(Cl)cc3[C@@H]2C1 | 3036780 | BBB+ |

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Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|---|----------|-------|
| (2S)-2-amino-5-(2,5-dioxo-4,4-diphenylimidazolidin-1-yl)pentanoic acid | N[C@@H](CCCN1C(=O)NC(c2cccc2)(c2cccc2)C1=O)C(=O)O | 93482134 | BBB+ |
| (3,4-dihydroxy-5-nitrophenyl)-(4-methylphenyl)methanone | Cc1ccc(C(=O)c2cc(O)c(O)c([N+]([O-])c2)cc1) | 4659569 | BBB+ |
| 8-[(E)-2-(3,4-dimethoxyphenyl)ethenyl]-1,3-diethyl-7-methylpurine-2,6-dione | CCn1c(=O)c2c(nc(/C=C/c3ccc(OC)c(OC)c3)n2C)n(CC)c1=O | 5311037 | BBB+ |
| 5-[(1S)-1-(2,3-dimethylphenyl)ethyl]-1H-imidazole | Cc1cccc([C@H](C)c2cnc[nH]2)c1C | 5311068 | BBB+ |
| (E,3R)-1-(1,3-benzodioxol-5-yl)-4,4-dimethylpent-1-en-3-ol | CC(C)(C)[C@H](O)/C=C/c1cc(c2c(c1)OCO2) | 38988294 | BBB+ |
| (3E)-3-(12H-[1]benzofuro[3,2-c][1]benzoxepin-6-ylidene)-N,N-dimethylpropan-1-amine | CN(C)CC/C=C1\c2cccc2OCc2c1oc1cccc21 | 6434185 | BBB+ |
| (3Z)-3-(12H-[1]benzofuro[3,2-c][1]benzoxepin-6-ylidene)-N,N-dimethylpropan-1-amine | CN(C)CC/C=C1/c2cccc2OCc2c1oc1cccc21 | 6436540 | BBB+ |

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Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|--|---------|-------|
| [(2S)-2-(2-chlorophenyl)-2-hydroxyethyl] carbamate | NC(=O)OC[C@@H](O)c1ccccc1Cl | 6918474 | BBB+ |
| (3R)-3-acetyloxy-4-(trimethylazaniumyl)butanoate | CC(=O)O[C@H](CC(=O)[O-])C[N+](C)(C)C | 7045767 | BBB+ |
| (2S)-2-[(4R)-2-oxo-4-propylpyrrolidin-1-yl]butanamide | CCC[C@@H]1CC(=O)N([C@H](CC)C(N)=O)C1 | 9837243 | BBB+ |
| 3-[(2R,3R)-1-(dimethylamino)-2-methylpentan-3-yl]phenol | CC[C@@H](c1ccccc(O)c1)[C@H](C)CN(C)C | 9838022 | BBB+ |
| 4-[2-[(6-ethoxy-1H-benzimidazol-2-yl)sulfanyl]ethyl]morpholine | CCOc1ccc2nc(SCCN3CCOCC3)[nH]c2c1 | 9862937 | BBB+ |
| methyl 3-[(4S)-8-bromo-1-methyl-6-pyridin-2-yl-4H-imidazo[1,2-a][1,4]benzodiazepin-4-yl]propanoate | COC(=O)CC[C@@H]1N=C(c2cccn2)c2cc(Br)ccc2-n2c(C)cnc21 | 9867812 | BBB+ |
| (5S)-5-hydroxy-5,6-dihydrobenzo[b][1]benzazepine-11-carboxamide | NC(=O)N1c2ccccc2C[C@H](O)c2ccccc21 | 9881504 | BBB+ |

Continued on next page

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|--|----------|-------|
| [(1S,2R,4S,5R)-9-methyl-3-oxa-9-azatricyclo[3.3.1.02,4]nonan-7-yl] (2S)-3-hydroxy-2-phenylpropanoate | CN1[C@@H]2C[C@H](OC(=O)[C@H](CO)c3ccccc3)C[C@H]1O[C@H]12 | 3081743 | BBB+ |
| 2-(2-oxo-1-phenyl-5-pyridin-2-ylpyridin-3-yl)benzonitrile | N#Cc1ccccc1-c1cc(-c2cccn2)cn(-c2ccccc2)c1=O | 9924495 | BBB+ |
| 1-[3-[3-(4-chlorophenyl)propoxy]propyl]piperidine | Clc1ccc(CCCOCCCN2CCCCC2)c1 | 9948102 | BBB+ |
| 1-[2-(2,4-dimethylphenyl)sulfanylphenyl]piperazine | Cc1ccc(Sc2ccccc2N2CCNCC2)c1 | 9966051 | BBB+ |
| 1-[(4-fluorophenyl)methyl]-1-(1-methylpiperidin-4-yl)-3-[[4-(2-methylpropoxy)phenyl]methyl]urea | CC(C)COc1ccc(CNC(=O)N(Cc2ccc(F)cc2)C2CCN(C)CC2)cc1 | 10071196 | BBB+ |
| [(2R)-2-amino-3-phenylpropyl] carbamate | NC(=O)OC[C@H](N)Cc1ccccc1 | 10130337 | BBB+ |
| N-[[(1R,2R)-2-(2,3-dihydro-1-benzofuran-4-yl)cyclopropyl]methyl]propanamide | CCC(=O)NC[C@@H]1C[C@H]1c1ccccc2c1CCO2 | 10220503 | BBB+ |

Continued on next page

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|---|----------|-------|
| 3-[4-[2-[4-(2,3-dichlorophenyl)piperazin-1-yl]ethyl]cyclohexyl]-1,1-dimethylurea | CN(C)C(=O)N[C@H]1CC[C@H](CCN2CCN(c3cccc(Cl)c3Cl)CC2)CC1 | 11154555 | BBB+ |
| (2S)-2,6-diamino-N-[(2S)-1-phenylpropan-2-yl]hexanamide | C[C@@H](Cc1ccccc1)NC(=O)[C@@H](N)CCCCN | 11597698 | BBB+ |
| [(1R)-1-(2-chlorophenyl)-2-(tetrazol-2-yl)ethyl] carbamate | NC(=O)O[C@@H](Cn1ncnn1)c1ccccc1Cl | 11962412 | BBB+ |
| 7-[4-[4-(1-benzothiophen-4-yl)piperazin-1-yl]butoxy]-1H-quinolin-2-one | O=c1ccc2ccc(OCCCCCCN3CCN(c4cccc5sc45)CC3)cc2[nH]1 | 11978813 | BBB+ |
| ethyl (1R,2S)-2-(dimethylamino)-1-phenylcyclohex-3-ene-1-carboxylate | CCOC(=O)[C@@@]1(c2ccccc2)C[C@H]1N(C)C | 12546498 | BBB+ |
| (2S,5S)-2-methylspiro[1,3-oxathiolane-5,3'-1-azabicyclo[2.2.2]octane] | C[C@H]1O[C@]2(CS1)CN1CC2CC1 | 18642481 | BBB+ |
| (1R,5S)-3-benzhydryloxy-8-ethyl-8-azabicyclo[3.2.1]octane | CCN1[C@@H]2CC[C@H]1C[C@H](OC(c1ccccc1)c1ccccc1)C2 | 20055089 | BBB+ |

Continued on next page

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| (6S,8R,9S,10R,13S,14S,17R)-17-acetyl-17-hydroxy-10,13-dimethyl-6-(trifluoromethyl)-2,6,7,8,9,11,12,14,15,16-decahydro-1H-cyclopenta[a]phenanthren-3-one | CC(=O)[C@@]1(O)CC[C@H]2[C@H]3C[C@H](C(F)(F)F)C4=CC(=O)CC[C@]4(C)[C@H]3CC[C@@]21C | 20055352 | BBB+ |
| [(2R,3R,11bR)-9,10-dimethoxy-3-(2-methylpropyl)-2,3,4,6,7,11b-hexahydro-1H-benzo[a]quinolizin-2-yl] (2S)-2-amino-3-methylbutanoate | COc1cc2c(cc1OC)[C@H]1C[C@@H](OC(=O)[C@@H](N)CC[C@H](CC(C)C)CN1CC2 | 24795069 | BBB+ |
| [(7R)-4-(5-chloro-1,3-benzoxazol-2-yl)-7-methyl-1,4-diazepan-1-yl]-[5-methyl-2-(triazol-2-yl)phenyl]methanone | Cc1ccc(-n2nccn2)c(C(=O)N2C(CN(c3nc4cc(Cl)ccc4o3)CC[C@H]2C)c1 | 24965990 | BBB+ |
| [(2R,3S,4R,5R)-5-(4-amino-2-oxopyrimidin-1-yl)-3,4-dihydroxyxolan-2-yl]methoxy-oxidophosphoryl] 2-(trimethylazaniumyl)ethyl phosphate | C[N+](C)(C)CCO[P+](O-)(O-)O[P+](O-)(O-)OC[C@H]1O[C@@H](n2ccc(N)nc2=O)[C@H](O)[C@@H]1O | 25202509 | BBB+ |
| 5-chloro-N-ethyl-4-hydroxy-1-methyl-2-oxo-N-phenylquinoline-3-carboxamide | CCN(C(=O)c1c(O)c2c(Cl)cccc2n(C)c1=O)c1ccccc1 | 54677946 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|---|-----------|-------|
| 2-[(1R,5S,6S)-6-(aminomethyl)-3-ethyl-6-bicyclo[3.2.0]hept-3-enyl]acetic acid | CCC1=C[C@@H]2[C@H](C1)C[C@]2(CN)CC(=O)O | 59509752 | BBB+ |
| [(1S,3S,5S)-6,6,9-trimethyl-9-azabicyclo[3.3.1]nonan-3-yl] 2-hydroxy-2,2-dithiophen-2-ylacetate | CN1[C@H]2CCC(C)(C)[C@@H]1C[C@@H](OC(=O)C(O)(c1cccs1)c1cccs1)C2 | 90471539 | BBB+ |
| [(1R,3R,5S)-6,6,9-trimethyl-9-azabicyclo[3.3.1]nonan-3-yl] 2-hydroxy-2,2-dithiophen-2-ylacetate | CN1[C@@H]2CCC(C)(C)[C@H]1C[C@H](OC(=O)C(O)(c1cccs1)c1cccs1)C2 | 118984411 | BBB+ |
| (4R)-6-chloro-N-ethyl-4-methyl-4-phenyl-1H-3,1-benzoxazin-2-imine | CC/N=C1\Nc2ccc(Cl)cc2[C@@H](C)(c2cccc2)O1 | 135564606 | BBB+ |
| 5-[3-(2,5-dichloro-4,6-dimethyl-1-oxidopyridin-1-i um-3-yl)-1,2,4-oxadiazol-5-yl]-3-nitrobenzene-1,2-diol | Cc1c(Cl)c(C)[n+]([O-])c(Cl)c1-c1noc(-c2cc(O)c(O)c([N+])(=O)[O-])c2)n1 | 135565903 | BBB+ |
| N'-(4-methoxyphenyl)methyl]-N,N-dimethyl-N'-pyridin-2-y lethane-1,2-diamine | COc1ccc(CN(CCN(C)C)c2cccn2)cc1 | 4992 | BBB+ |

Continued on next page

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|---|----------|-------|
| 2-[(S)-(4-chlorophenyl)-pyridin-2-ylmethoxy]-N,N-dimethylethanamine | CN(C)CCO[C@H](c1ccc(Cl)c1)c1ccccn1 | 170336 | BBB+ |
| (2S)-N,N,2-trimethyl-3-phenoxythiazin-10-ylpropan-1-amine | C[C@H](CN(C)C)CN1c2cccc2Sc2cccc21 | 6604496 | BBB+ |
| (3S)-N,N-dimethyl-3-phenyl-3-pyridin-2-ylpropan-1-amine | CN(C)CC[C@H](c1ccccc1)c1ccccn1 | 667440 | BBB+ |
| 1-benzhydryl-4-methylpiperazine | CN1CCN(C(c2cccc2)c2cccc2)CC1 | 6726 | BBB+ |
| 1-[(R)-(4-chlorophenyl)-phenylmethyl]-4-methylpiperazine | CN1CCN([C@H](c2cccc2)c2cc(c(Cl)cc2)CC1) | 688438 | BBB+ |
| 1-[(R)-(4-chlorophenyl)-phenylmethyl]-4-[(3-methylphenyl)methyl]piperazine | Cc1cccc(CN2CCN([C@H](c3ccc(cc3)C(Cl)cc3)CC2)c1) | 23307231 | BBB+ |
| 2-benzhydryloxy-N,N-dimethylethanamine | CN(C)CCOC(c1ccccc1)c1cccc1 | 3100 | BBB+ |
| (3S)-3-(4-bromophenyl)-N,N-dimethyl-3-pyridin-2-ylpropan-1-amine | CN(C)CC[C@H](c1ccc(Br)cc1)c1ccccn1 | 16960 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| N'-(4-chlorophenyl)methyl]-N,N-dimethyl-N'-pyridin-2-yethane-1,2-diamine | CN(C)CCN(Cc1ccc(Cl)cc1)c1ccc cn1 | 25295 | BBB+ |
| N,N-dimethyl-2-[(1R)-1-phenyl-1-pyridin-2-yethoxy]ethanamine | CN(C)CCO[C@](C)(c1cccc1)c 1ccccn1 | 6852255 | BBB+ |
| N'-benzyl-N,N-dimethyl-N'-pyridin-2-yethane-1,2-diamine | CN(C)CCN(Cc1cccc1)c1cccn1 | 5587 | BBB+ |
| N,N-dimethyl-2-[3-[(1R)-1-pyridin-2-yethyl]-1H-inden-2-yl]ethanamine | C[C@H](C1=C(CCN(C)C)Cc2c cccc21)c1cccn1 | 12963076 | BBB+ |
| 1-methyl-4-(2-tricyclo[9.4.0.03,8]pentadeca-1(15),3,5,7,9,11,13-heptaenylidene)piperidine | CN1CCC(=C2c3cccc3C=Cc3cc ccc32)CC1 | 2913 | BBB+ |
| N-benzyl-N-(4,5-dihydro-1H-imidazol-2-ylmethyl)aniline | c1ccc(CN(CC2=NCCN2)c2cccc 2)cc1 | 2200 | BBB+ |
| (3S)-3-(4-chlorophenyl)-N,N-dimethyl-3-pyridin-2-ylpropan-1-amine | CN(C)CC[C@@H](c1ccc(Cl)cc1)c1cccn1 | 33036 | BBB+ |
| (2R)-2-[2-[(1R)-1-(4-chlorophenyl)-1-phenylethoxy]ethyl]-1-methylpyrrolidine | CN1CCC[C@@H]1CCO[C@](C (c1cccc1)c1ccc(Cl)cc1 | 26987 | BBB+ |

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|---|---|----------|-------|
| 2-[2-[4-[(R)-(4-chlorophenyl)-phenylmethyl]piperazin-1-yl]ethoxy]ethanol | OCCOCCN1CCN([C@H](c2cccc2)c2)ccc(Cl)cc2)CC1 | 1548974 | BBB+ |
| N,N-dimethyl-2-[(S)-(2-methylphenyl)-phenylmethoxy]ethanamine | Cc1ccccc1[C@@H](OCCN(C)C)c1 | 736041 | BBB+ |
| 2-[(R)-(4-bromophenyl)-phenylmethoxy]-N,N-dimethylethanamine | CN(C)CCO[C@H](c1ccccc1)c1cc(Br)cc1 | 45266805 | BBB+ |
| 2-[(E)-1-(4-methylphenyl)-3-pyrrolidin-1-ylprop-1-enyl]pyridine | Cc1ccc(/C(=C\CN2CCCC2)c2cccn2)cc1 | 5282443 | BBB+ |
| (2R)-2-(3-fluoro-4-phenylphenyl)propanoic acid | Fc2cc(ccc2c1ccccc1)[C@H](C(=O)O)C | 92337 | BBB- |
| 3-[(E)-3-anilino-3-oxoprop-1-enyl]-4,6-dichloro-1H-indole-2-carboxylic acid | OC(C1=C(/C=C/C(NC2=CC=CC=C2)=O)C3=C(Cl)C=C(Cl)C=C3N1)=O | 6450546 | BBB- |
| 4-(2-aminoethyl)benzene-1,2-diol | NCCc1cc(O)c(O)cc1 | 681 | BBB- |

Continued on next page

Table SI. 1 – continued from previous page

| Compound Name | SMILES | CID | Class |
|--|--|-------|-------|
| [(1S,2S,3R,4S,7R,9S,10S,12R,15S)-4,12-diacetoxy-15-[(2R,3S)-3-benzamido-2-hydroxy-3-phenylpropanoyl]oxy-1,9-dihydroxy-10,14,17,17-tetramethyl-11-oxo-6-oxatetracyclo[11.3.1.03,10.04,7]heptadec-13-en-2-yl] benzoate | CC1=C2[C@@]([C@]([C@H]([C@@H]3[C@]4([C@H](OC4)C[C@@H]([C@]3(C(=O)[C@H]2OC(=O)C)C)O)OC(=O)C)OC(=O)[C@H](O)[C@@H](N(C(=O)c6cccc6)c7cccc7O)(C)C | 36314 | BBB- |

Table SI. 2 Evaluation metrics results of all classification model–sampling strategy combinations on the test dataset

| model_name | ROC_AUC | sensitivity | specificity | precision | accuracy | F1 | MCC | GEOM | BACC | AP |
|----------------------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-------------------|
| dtree-kmeans_SMOTE | 0.9000 ±0.0094 | 0.8814 ±0.0158 | 0.7472 ±0.0289 | 0.8692 ±0.0120 | 0.8352 ±0.0101 | 0.8751 ±0.0079 | 0.6332 ±0.0227 | 0.8113 ±0.0136 | 0.8143 ±0.0124 | 0.9300 ±0.0100 |
| dtree-common | 0.8982 ±0.0152 | 0.9005 ±0.0225 | 0.7241 ±0.0347 | 0.8615 ±0.0153 | 0.8397 ±0.0183 | 0.8804 ±0.0141 | 0.6399 ±0.0411 | 0.8072 ±0.0211 | 0.8123 ±0.0200 | 0.9291 ±0.0112 |
| dtree-classic_SMOTE | 0.8942 ±0.0159 | 0.8194 ±0.0301 | 0.7904 ±0.0372 | 0.8818 ±0.0182 | 0.8094 ±0.0203 | 0.8491 ±0.0174 | 0.5948 ±0.0412 | 0.8043 ±0.0203 | 0.8049 ±0.0204 | 0.9332 ±0.0105 |
| dtree-classic_RandUndersampling | 0.8892 ±0.0137 | 0.7983 ±0.0198 | 0.8178 ±0.0275 | 0.8931 ±0.0140 | 0.8050 ±0.0147 | 0.8429 ±0.0127 | 0.5948 ±0.0299 | 0.8078 ±0.0155 | 0.8081 ±0.0155 | 0.9265 ±0.0106 |
| dtree-classic_ADASYN | 0.8931 ±0.0124 | 0.8346 ±0.0208 | 0.7817 ±0.0246 | 0.8793 ±0.0118 | 0.8164 ±0.0152 | 0.8562 ±0.0129 | 0.6045 ±0.0308 | 0.8076 ±0.0154 | 0.8082 ±0.0152 | 0.9291 ±0.0116 |
| dtree-borderline_SMOTE | 0.8941 ±0.0121 | 0.8218 ±0.0276 | 0.8139 ±0.0285 | 0.8940 ±0.0130 | 0.8191 ±0.0147 | 0.8560 ±0.0137 | 0.6182 ±0.0266 | 0.8175 ±0.0129 | 0.8178 ±0.0128 | 0.9278 ±0.0127 |
| knn-kmeans_SMOTE | 0.9428 ±0.0067 | 0.9502 ±0.0132 | 0.7096 ±0.0306 | 0.8618 ±0.0123 | 0.8673 ±0.0123 | 0.9037 ±0.0087 | 0.7009 ±0.0291 | 0.8209 ±0.0176 | 0.8299 ±0.0155 | 0.9638 ±0.0068 |
| knn-common | 0.9426 ±0.0065 | 0.9547 ±0.0119 | 0.6853 ±0.0186 | 0.8524 ±0.0072 | 0.8619 ±0.0089 | 0.9006 ±0.0066 | 0.6888 ±0.0214 | 0.8088 ±0.0110 | 0.8200 ±0.0098 | 0.9638 ±0.0066 |
| knn-classic_SMOTE | 0.9436 ±0.0062 | 0.9067 ±0.0098 | 0.8248 ±0.0237 | 0.9079 ±0.0114 | 0.8785 ±0.0112 | 0.9073 ±0.0084 | 0.7312 ±0.0254 | 0.8647 ±0.0141 | 0.8658 ±0.0136 | 0.9649 ±0.0063 |
| knn-classic_RandUndersampling | 0.9387 ±0.0080 | 0.9100 ±0.0130 | 0.7860 ±0.0187 | 0.8900 ±0.0093 | 0.8673 ±0.0131 | 0.8999 ±0.0101 | 0.7037 ±0.0290 | 0.8457 ±0.0142 | 0.8480 ±0.0139 | 0.9628 ±0.0063 |
| knn-classic_ADASYN | 0.9425 ±0.0065 | 0.8636 ±0.0144 | 0.8820 ±0.0186 | 0.9331 ±0.0101 | 0.8700 ±0.0126 | 0.8970 ±0.0104 | 0.7256 ±0.0261 | 0.8727 ±0.0130 | 0.8728 ±0.0131 | 0.9644 ±0.0057 |
| knn-borderline_SMOTE | 0.9417 ±0.0059 | 0.8686 ±0.0134 | 0.8805 ±0.0129 | 0.9326 ±0.0061 | 0.8727 ±0.0071 | 0.8994 ±0.0063 | 0.7302 ±0.0130 | 0.8744 ±0.0059 | 0.8745 ±0.0059 | 0.9644 ±0.0056 |
| logreg-kmeans_SMOTE | 0.9182 ±0.0098 | 0.9145 ±0.0090 | 0.7398 ±0.0227 | 0.8700 ±0.0101 | 0.8543 ±0.0105 | 0.8917 ±0.0076 | 0.6719 ±0.0241 | 0.8225 ±0.0138 | 0.8272 ±0.0128 | 0.9488 ±0.0084 |
| logreg-common | 0.9168 ±0.0095 | 0.9219 ±0.0115 | 0.7183 ±0.0251 | 0.8617 ±0.0104 | 0.8518 ±0.0089 | 0.8907 ±0.0065 | 0.6650 ±0.0205 | 0.8136 ±0.0129 | 0.8201 ±0.0115 | 0.9487 ±0.0082 |
| logreg-classic_SMOTE | 0.9190 ±0.0120 | 0.8622 ±0.0192 | 0.8225 ±0.0315 | 0.9026 ±0.0163 | 0.8485 ±0.0168 | 0.8818 ±0.0135 | 0.6730 ±0.0363 | 0.8419 ±0.0187 | 0.8424 ±0.0186 | 0.9491 ±0.0105 |
| logreg-classic_RandUndersampling | 0.9137 ±0.0086 | 0.8548 ±0.0156 | 0.8025 ±0.0252 | 0.8918 ±0.0129 | 0.8368 ±0.0153 | 0.8728 ±0.0122 | 0.6465 ±0.0327 | 0.8281 ±0.0169 | 0.8286 ±0.0167 | 0.9478 ±0.0079 |
| logreg-classic_ADASYN | 0.9122 ±0.0095 | 0.8021 ±0.0226 | 0.8562 ±0.0202 | 0.9138 ±0.0121 | 0.8207 ±0.0190 | 0.8542 ±0.0165 | 0.6331 ±0.0366 | 0.8286 ±0.0183 | 0.8291 ±0.0182 | 0.9484 ±0.0072 |
| logreg-borderline_SMOTE | 0.9107 ±0.0099 | 0.8109 ±0.0226 | 0.8491 ±0.0247 | 0.9110 ±0.0137 | 0.8241 ±0.0179 | 0.8579 ±0.0155 | 0.6367 ±0.0353 | 0.8297 ±0.0176 | 0.8300 ±0.0177 | 0.9467 ±0.0078 |
| xgb-kmeans_SMOTE | 0.9588 ±0.0044 | 0.9392 ±0.0112 | 0.7919 ±0.0235 | 0.8958 ±0.0103 | 0.8885 ±0.0092 | 0.9170 ±0.0068 | 0.7498 ±0.0209 | 0.8623 ±0.0123 | 0.8656 ±0.0114 | 0.9774 ±0.0038 |
| xgb-common | 0.9589 ±0.0044 | 0.9409 ±0.0097 | 0.7923 ±0.0235 | 0.8961 ±0.0105 | 0.8897 ±0.0099 | 0.9179 ±0.0072 | 0.7524 ±0.0226 | 0.8633 ±0.0132 | 0.8666 ±0.0123 | 0.9775 ±0.0036 |
| gb-classic_SMOTE | 0.9593 ±0.0045 | 0.9292 ±0.0131 | 0.8205 ±0.0217 | 0.9079 ±0.0098 | 0.8917 ±0.0095 | 0.9184 ±0.0072 | 0.7585 ±0.0213 | 0.8730 ±0.0113 | 0.8748 ±0.0108 | 0.9773 ±0.0043 |
| xgb-classic_RandUndersampling | 0.9523 ±0.0052 | 0.8908 ±0.0117 | 0.8699 ±0.0172 | 0.9288 ±0.0085 | 0.8836 ±0.0081 | 0.9094 ±0.0066 | 0.7485 ±0.0173 | 0.8802 ±0.0089 | 0.8804 ±0.0088 | 0.9739 ±0.0041 |
| xgb-classic_ADASYN | 0.9585 ±0.0048 | 0.9275 ±0.0121 | 0.8233 ±0.0180 | 0.9090 ±0.0080 | 0.8916 ±0.0083 | 0.9181 ±0.0065 | 0.7583 ±0.0184 | 0.8737 ±0.0094 | 0.8754 ±0.0091 | 0.9770 ±0.0040 |
| xgb-borderline_SMOTE | 0.9588 ±0.0048 | 0.9259 ±0.0131 | 0.8237 ±0.0210 | 0.9091 ±0.0095 | 0.8906 ±0.0092 | 0.9173 ±0.0071 | 0.7564 ±0.0204 | 0.8732 ±0.0108 | 0.8748 ±0.0104 | 0.9770 ±0.0046 |