

Android Malware Detection

Machine Learning I

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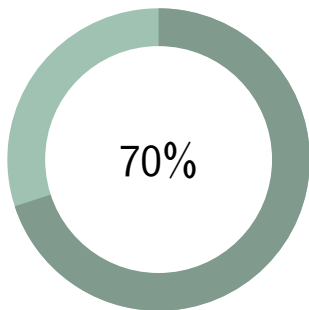
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GROUP C

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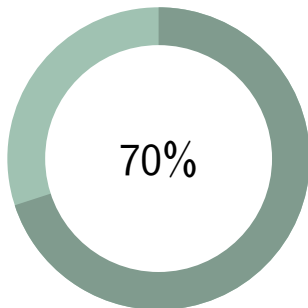
Introduction

The problem



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Introduction

About the dataset

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1 355,630 rows

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- 1 355,630 rows
- 2 86 columns

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- 3 4 classes

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 - Android Adware

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 - Android Scareware

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 - Benign

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- 4 Network flow characteristics

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- 4 Network flow characteristics
- 5 Statistics of android apps behaviour

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 - IP (source and dest)
 - Ports

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 - IP (source and dest)
 - Ports
 - Protocol

Introduction

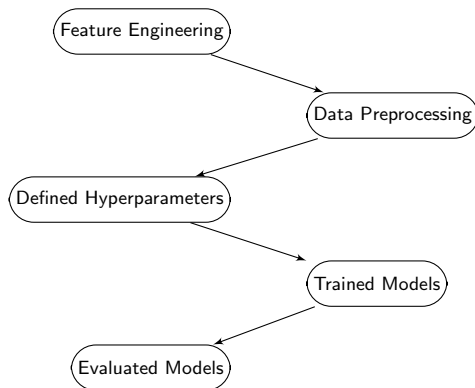
About the dataset

- 1 355,630 rows
- 2 86 columns
- 3 4 classes
 - Android Adware
 - Android Scareware
 - Android SMS Malware
 - Benign
- 4 Network flow characteristics
- 5 Statistics of android apps behaviour
 - IP (source and dest)
 - Ports
 - Protocol
 - Packets details

Dataset

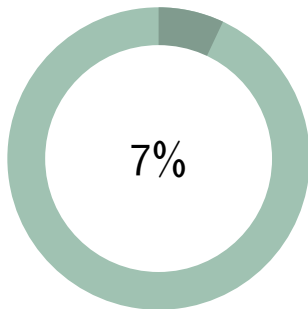
Label	Dataset Entries	Used Entries
Android_Adware	147,443	1,475
Android_Scareware	117,082	1,171
Android_SMS_Malware	67,397	674
Benign	23,708	237
Total size	355,630	3,557

Pipeline

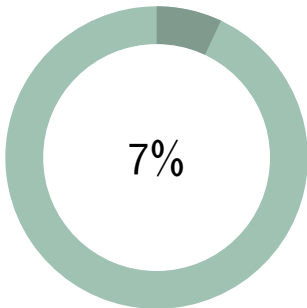


Approaches

Data Preprocessing



Data Preprocessing



Label	Entries
Benign	237
Malware	3,320
Total size	3,557

Approach 1: Binary Classification

Results: kNN

k	Accuracy	Recall	Specificity	F1-Score	CM
1	87.22%	94.19%	8.62%	93.12%	[616 53; 38 5]
2	80.48%	86.39%	13.79%	89.05%	[565 50; 89 8]
3	90.03%	97.86%	1.72%	94.74%	[640 57; 14 1]
5	91.43%	99.54%	0.0%	95.52%	[651 58; 3 0]
7	91.85%	100.0%	0.0%	95.75%	[654 58; 0 0]
10	91.85%	100.0%	0.0%	95.75%	[654 58; 0 0]
15	91.85%	100.0%	0.0%	95.75%	[654 58; 0 0]

Table: kNN metrics result

Approach 1: Binary Classification

Conclusion

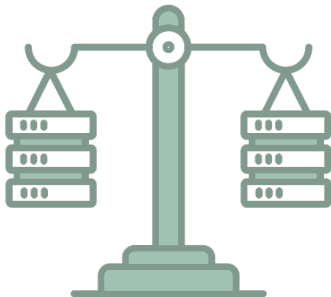
- Excellent recall.
- Poor specificity.
- Models predicting nearly every instance as malware.



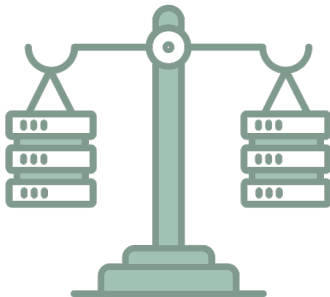
Data Preprocessing

Approach 2: Binary Classification with Balanced Classes

Data Preprocessing



Data Preprocessing



Label	Entries
Benign	3,320
Malware	3,320
Total size	6,640

Approach 2: Binary Classification with Balanced Classes

Results: kNN CV

k	Accuracy	Recall	Specificity	F1-Score
1	95.33% (0.01)	90.66% (0.02)	100.0% (0.0)	95.1% (0.01)
2	91.3% (0.01)	82.6% (0.02)	100.0% (0.0)	90.46% (0.01)
3	91.3% (0.01)	82.6% (0.02)	100.0% (0.0)	90.46% (0.01)
5	87.71% (0.01)	75.41% (0.02)	100.0% (0.0)	85.97% (0.01)
7	83.98% (0.01)	67.96% (0.03)	100.0% (0.0)	80.89% (0.02)
10	77.97% (0.01)	56.06% (0.03)	99.89% (0.0)	71.76% (0.02)
15	72.36% (0.01)	48.87% (0.02)	95.86% (0.02)	63.86% (0.02)

Table: kNN metrics result for CrossValidation

Approach 2: Binary Classification with Balanced Classes

Results: Decision Tree CV

MaxDepth	Accuracy	Recall	Specificity	F1-Score
3	56.85% (0.02)	42.33% (0.22)	71.37% (0.22)	46.65% (0.13)
5	61.8% (0.02)	42.16% (0.12)	81.44% (0.14)	51.67% (0.06)
7	67.28% (0.02)	51.42% (0.13)	83.14% (0.09)	60.14% (0.08)
10	77.59% (0.03)	64.57% (0.08)	90.62% (0.05)	74.01% (0.05)
15	88.57% (0.02)	78.77% (0.04)	98.38% (0.01)	87.28% (0.03)
None	95.29% (0.01)	90.59% (0.02)	100.0% (0.0)	95.05% (0.01)

Table: Decision Tree metrics result for CrossValidation

Approach 2: Binary Classification with Balanced Classes

Results: Decision Tree

MaxDepth	Accuracy	Recall	Specificity	F1-Score	CM
3	58.89%	43.52%	74.25%	51.42%	[289 171; 375 493]
5	63.03%	49.55%	76.51%	57.27%	[329 156; 335 508]
7	71.23%	58.73%	83.73%	67.13%	[390 108; 274 556]
10	81.4%	65.81%	96.99%	77.97%	[437 20; 227 644]
15	91.04%	82.08%	100.0%	90.16%	[545 0; 119 664]
None	96.31%	92.62%	100.0%	96.17%	[615 0; 49 664]

Table: Decision Tree metrics result

Approach 2: Binary Classification with Balanced Classes

Results: SVM

Kernel	C	Accuracy	Recall	Specificity	F1-Score	CM
rbf	0.1	57.3%	59.49%	55.12%	58.22%	[395 298; 269 366]
rbf	1.0	63.18%	56.63%	69.73%	60.6%	[376 201; 288 463]
rbf	10.0	72.44%	61.75%	83.13%	69.14%	[410 112; 254 552]
poly	0.1	56.78%	89.31%	24.25%	67.39%	[593 503; 71 161]
poly	1.0	63.93%	76.96%	50.9%	68.09%	[511 326; 153 338]
linear	0.1	58.51%	54.52%	62.5%	56.78%	[362 249; 302 415]
linear	1.0	58.66%	57.08%	60.24%	58.0%	[379 264; 285 400]
linear	10.0	59.19%	60.54%	57.83%	59.73%	[402 280; 262 384]

Table: SVM metrics result

Approach 2: Binary Classification with Balanced Classes

Results: Ensembles CV

Ensemble Model	Parameters	Accuracy	Recall	Specificity	F1-Score
Hard Voting		94.33% (0.01)	88.67% (0.02)	100.0% (0.0)	93.98% (0.01)
Stacking (Decision Tree)	Max Depth = None	97.27% (0.01)	98.42% (0.01)	96.12% (0.02)	97.31% (0.01)
Stacking (kNN)	numNeighbors = 1	97.27% (0.01)	98.42% (0.01)	96.12% (0.02)	97.31% (0.01)
Stacking (SVM)	C = 10, kernel = rbf	99.1% (0.0)	98.19% (0.01)	100.0% (0.0)	99.09% (0.0)

Table: Ensemble Model metrics result for CrossValidation

Approach 2: Binary Classification with Balanced Classes

Results: Ensembles

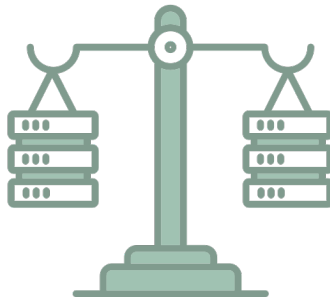
Ensemble Model	Final Estimator	Accuracy	Recall	Specificity	F1-Score	CM
Hard Voting		95.11%	90.21%	100.0%	94.85%	[599 0; 65 664]
Stacking (Decision Tree)	Max Depth = None	95.26%	98.34%	92.17%	95.4%	[653 52; 11 612]
Stacking (kNN)	numNeighbors = 1	95.26%	98.34%	92.17%	95.4%	[653 52; 11 612]
Stacking (SVM)	C = 10, kernel = rbf	99.02%	98.04%	100.0%	99.01%	[651 0; 13 664]

Table: Ensemble Model metrics result

Approach 2: Binary Classification with Balanced Classes

Conclusion

- Significant enhancement in binary classification.
- Ensembles as the top performer:
 - Combining base models.
 - Enhanced knowledge representation.

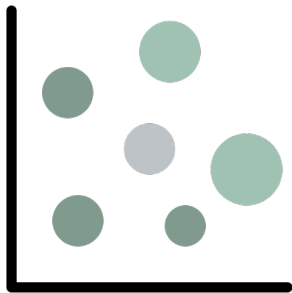


Approach 3: Multiclass Classification

Data Preprocessing

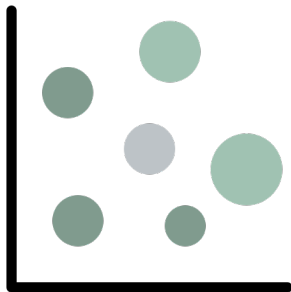
Approach 3: Multiclass Classification

Data Preprocessing



Approach 3: Multiclass Classification

Data Preprocessing



Label	Entries
Benign	1,475
Android_Scareware	1,475
Android_SMS_Malware	1,475
Android_Adware	1,475
Total size	5,900

Approach 3: Multiclass Classification

Results: ANN CV

Architecture	Accuracy	Recall	Specificity	F1-Score
20	33.21% (0.01)	33.21% (0.01)	77.75% (0.0)	32.2% (0.01)
40	32.82% (0.01)	32.82% (0.01)	77.61% (0.0)	30.85% (0.01)
80	31.43% (0.01)	31.43% (0.01)	77.13% (0.0)	27.34% (0.01)
100	30.83% (0.01)	30.83% (0.01)	76.95% (0.0)	26.02% (0.01)
60, 120	30.2% (0.0)	30.2% (0.0)	76.71% (0.0)	21.09% (0.01)
80, 50	31.67% (0.01)	31.67% (0.01)	77.22% (0.0)	25.56% (0.01)
80, 100	30.12% (0.01)	30.12% (0.01)	76.71% (0.0)	21.38% (0.01)
100, 40	31.61% (0.01)	31.61% (0.01)	77.21% (0.0)	25.89% (0.01)

Table: ANN metrics result for CrossValidation

Approach 3: Multiclass Classification

Results: ANN

Architecture	Accuracy	Recall	Specificity	F1-Score	CM
20	22.37%	22.37%	73.78%	20.66%	[67 104 105 26; 78 56 135 35; 76 64 124 32; 117 48 96 17]
40	20.59%	20.59%	72.99%	17.85%	[147 80 55 20; 166 35 68 35; 171 61 43 21; 175 48 37 18]
80	23.9%	23.9%	74.66%	23.48%	[78 87 51 86; 86 86 36 96; 69 97 41 89; 87 88 26 77]
100	21.44%	21.44%	73.11%	17.1%	[74 200 15 13; 105 155 12 32; 107 153 9 27; 128 120 15 15]
60, 120	23.64%	23.64%	75.28%	17.65%	[3 44 132 123; 7 12 137 148; 8 21 115 152; 8 18 103 149]
80, 50	21.44%	21.44%	74.18%	16.98%	[12 169 20 101; 28 99 10 167; 22 115 10 149; 31 101 14 132]
80, 100	25.42%	25.42%	74.6%	17.27%	[239 24 31 8; 208 7 65 24; 220 12 45 19; 219 7 43 9]
100, 40	23.9%	23.9%	75.43%	17.48%	[6 29 126 141; 12 5 139 148; 9 15 119 153; 20 8 98 152]

Table: ANN metrics result

Approach 3: Multiclass Classification

Results: kNN CV

k	Accuracy	Recall	Specificity	F1-Score
1	71.65% (0.02)	71.65% (0.02)	90.54% (0.01)	70.28% (0.02)
2	62.31% (0.02)	62.31% (0.02)	87.44% (0.01)	60.55% (0.02)
3	57.35% (0.02)	57.35% (0.02)	85.78% (0.01)	55.48% (0.02)
5	52.04% (0.02)	52.04% (0.02)	84.0% (0.01)	49.75% (0.02)
7	47.67% (0.03)	47.67% (0.03)	82.57% (0.01)	45.61% (0.03)
10	41.42% (0.03)	41.42% (0.03)	80.48% (0.01)	40.28% (0.03)
15	39.47% (0.03)	39.47% (0.03)	79.83% (0.01)	38.99% (0.03)

Table: kNN metrics result for CrossValidation

Approach 3: Multiclass Classification

Results: kNN

k	Accuracy	Recall	Specificity	F1-Score	CM
1	71.78%	71.78%	90.64%	70.38%	[302 0 0 0; 22 143 85 54; 14 86 154 42; 4 10 16 248]
2	63.73%	63.73%	87.91%	61.89%	[297 5 0 0; 22 172 45 65; 14 133 82 67; 4 67 6 201]
3	57.97%	57.97%	86.01%	56.11%	[297 5 0 0; 35 127 70 72; 43 85 100 68; 17 62 39 160]
5	56.19%	56.19%	85.36%	54.22%	[285 5 8 4; 46 128 68 62; 65 72 100 59; 35 53 40 150]
7	50.42%	50.42%	83.37%	48.24%	[270 14 8 10; 67 112 73 52; 81 72 87 56; 48 54 50 126]
10	43.98%	43.98%	81.21%	42.53%	[216 30 28 28; 84 109 60 51; 91 72 74 59; 52 58 48 120]
15	40.0%	40.0%	79.94%	39.13%	[182 36 46 38; 78 100 72 54; 81 70 75 70; 66 49 48 115]

Table: kNN metrics result

Approach 3: Multiclass Classification

Results: Decision Tree CV

MaxDepth	Accuracy	Recall	Specificity	F1-Score
3	33.41% (0.02)	33.41% (0.02)	77.87% (0.01)	29.11% (0.03)
5	36.65% (0.03)	36.65% (0.03)	78.93% (0.01)	34.46% (0.03)
7	40.68% (0.02)	40.68% (0.02)	80.28% (0.01)	39.03% (0.02)
10	48.6% (0.02)	48.6% (0.02)	82.9% (0.01)	47.87% (0.02)
15	62.88% (0.03)	62.88% (0.03)	87.64% (0.01)	62.15% (0.03)
nothing	71.95% (0.02)	71.95% (0.02)	90.64% (0.01)	70.58% (0.02)

Table: Decision Tree metrics result for CrossValidation

Approach 3: Multiclass Classification

Results: Decision Tree

MaxDepth	Accuracy	Recall	Specificity	F1-Score	CM
3	34.92%	34.92%	78.14%	29.99%	[142 99 0 61; 104 133 0 67; 104 121 0 71; 74 67 0 137]
5	37.29%	37.29%	78.86%	35.23%	[200 45 31 26; 125 69 59 51; 142 60 51 43; 89 26 43 120]
7	42.46%	42.46%	80.56%	40.53%	[212 56 22 12; 122 83 55 44; 124 69 58 45; 62 33 35 148]
10	49.92%	49.92%	83.14%	49.06%	[205 62 20 15; 65 117 80 42; 79 83 88 46; 24 39 36 179]
15	67.2%	67.2%	89.11%	65.99%	[264 19 15 4; 38 146 72 48; 35 62 142 57; 5 12 20 241]
nothing	73.39%	73.39%	91.19%	71.85%	[302 0 0 0; 31 144 84 45; 17 65 164 50; 2 8 12 256]

Table: DecisionTree metrics result

Approach 3: Multiclass Classification

Results: SVM CV

Kernel	C	Accuracy	Recall	Specificity	F1-Score
rbf	0.1	30.87% (0.02)	30.87% (0.02)	77.01% (0.01)	27.17% (0.02)
rbf	1.0	35.93% (0.02)	35.93% (0.02)	78.71% (0.01)	35.01% (0.02)
rbf	10.0	42.2% (0.01)	42.2% (0.01)	80.79% (0.0)	41.5% (0.01)
poly	0.1	32.12% (0.02)	32.12% (0.02)	77.42% (0.01)	27.33% (0.02)
poly	1.0	35.42% (0.02)	35.42% (0.02)	78.6% (0.0)	33.2% (0.02)
linear	0.1	32.5% (0.02)	32.5% (0.02)	77.56% (0.01)	31.06% (0.02)
linear	1.0	33.2% (0.01)	33.2% (0.01)	77.8% (0.0)	31.9% (0.01)
linear	10.0	32.86% (0.02)	32.86% (0.02)	77.69% (0.01)	31.61% (0.02)

Table: SVM metrics result for CrossValidation

Approach 3: Multiclass Classification

Results: SVM

Kernel	C	Accuracy	Recall	Specificity	F1-Score	CM
rbf	0.1	29.07%	29.07%	76.08%	25.62%	[91 140 7 64; 56 165 15 68; 66 163 10 57; 68 127 6 77]
rbf	1.0	34.66%	34.66%	77.94%	33.64%	[151 84 42 25; 75 125 55 49; 95 100 50 51; 66 88 41 83]
rbf	10.0	40.93%	40.93%	80.06%	40.44%	[171 67 50 14; 71 131 61 41; 74 105 69 48; 46 71 49 112]
poly	0.1	29.49%	29.49%	76.22%	24.41%	[39 184 8 71; 8 211 20 65; 15 209 13 59; 15 172 6 85]
poly	1.0	35.08%	35.08%	77.86%	33.23%	[81 162 43 16; 25 209 40 30; 30 191 45 30; 20 147 32 79]
linear	0.1	30.68%	30.68%	76.63%	28.68%	[111 115 24 52; 63 152 29 60; 86 129 28 53; 63 111 33 71]
linear	1.0	30.85%	30.85%	76.68%	29.24%	[114 104 41 43; 61 147 37 59; 81 131 32 52; 61 105 41 71]
linear	10.0	30.93%	30.93%	76.65%	29.2%	[117 108 43 34; 59 151 43 51; 84 133 31 48; 62 110 40 66]

Table: SVM metrics result

Approach 3: Multiclass Classification

Results: Ensembles CV

Ensemble Model	Parameters	Accuracy	Recall	Specificity	F1-Score
Hard Voting		72.63% (0.02)	72.63% (0.02)	90.89% (0.01)	71.53% (0.02)
Stacking (Decision Tree)	Max Depth = None	65.11% (0.03)	65.11% (0.03)	88.38% (0.01)	65.13% (0.03)
Stacking (kNN)	numNeighbors = 1	65.32% (0.03)	65.32% (0.03)	88.45% (0.01)	65.25% (0.03)
Stacking (SVM)	C = 10, kernel = rbf	74.56% (0.02)	74.56% (0.02)	91.55% (0.01)	74.47% (0.02)

Table: Ensemble Model metrics result for CrossValidation

Approach 3: Multiclass Classification

Results: Ensembles

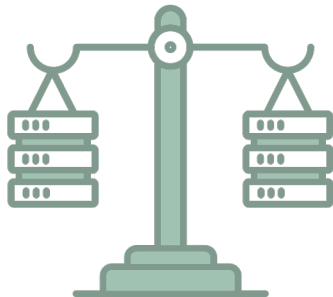
Ensemble Model	Final Estimator	Accuracy	Recall	Specificity	F1-Score	CM
Hard Voting		74.24%	74.24%	91.38%	73.11%	[302 0 0 0; 23 187 59 35; 13 106 139 38; 0 16 14 248]
Stacking (Decision Tree)	Max Depth = None	68.98%	68.98%	89.6%	69.16%	[284 18 0 0; 8 162 102 32; 2 99 160 35; 0 34 36 208]
Stacking (kNN)	numNeighbors = 1	69.49%	69.49%	89.78%	69.48%	[288 12 2 0; 8 156 112 28; 2 98 157 39; 0 38 21 219]
Stacking (SVM)	C = 10, kernel = rbf	77.37%	77.37%	92.38%	77.22%	[302 0 0 0; 7 198 83 16; 2 104 171 19; 0 6 30 242]

Table: Ensemble Model metrics result

Approach 3: Multiclass Classification

Conclusion

- Data balancing remains crucial.
- Ensembles keeps demonstrating superior outcomes.
- Remarkably good results for a 4-class problem.



Approach 4: Multiclass Classification with data dimensionality reduction

Data Preprocessing

Approach 4: Multiclass Classification with data dimensionality reduction

Data Preprocessing



Approach 4: Multiclass Classification with data dimensionality reduction

Data Preprocessing



Label	Entries
Benign	1,475
Android_Scareware	1,475
Android_SMS_Malware	1,475
Android_Adware	1,475
Total size	5,900

Approach 4: Multiclass Classification with data dimensionality reduction

Results: ANN CV

Architecture	Accuracy	Recall	Specificity	F1-Score
20	29.31% (0.01)	29.31% (0.01)	76.42% (0.0)	26.94% (0.01)
40	28.93% (0.01)	28.93% (0.01)	76.29% (0.0)	25.32% (0.01)
80	28.04% (0.01)	28.04% (0.01)	76.0% (0.0)	22.05% (0.01)
100	27.94% (0.01)	27.94% (0.01)	75.97% (0.0)	21.27% (0.01)
60, 120	27.55% (0.01)	27.55% (0.01)	75.83% (0.0)	17.43% (0.01)
80, 50	28.04% (0.01)	28.04% (0.01)	76.0% (0.0)	19.56% (0.01)
80, 100	27.5% (0.01)	27.5% (0.01)	75.85% (0.0)	17.23% (0.01)
100, 40	27.92% (0.01)	27.92% (0.01)	75.98% (0.0)	19.62% (0.01)

Table: ANN metrics result for CrossValidation

Approach 4: Multiclass Classification with data dimensionality reduction

Results: ANN

Architecture	Accuracy	Recall	Specificity	F1-Score	CM
20	24.92%	24.92%	74.6%	19.58%	[119 38 129 16; 117 11 165 11; 101 23 156 16; 123 27 120 8]
40	26.36%	26.36%	75.06%	19.43%	[144 12 136 10; 129 2 164 9; 131 4 155 6; 145 5 118 10]
80	20.59%	20.59%	72.66%	15.58%	[98 187 10 7; 152 133 12 7; 143 139 5 9; 152 113 6 7]
100	24.24%	24.24%	73.94%	18.08%	[123 158 9 12; 137 152 7 8; 143 138 5 10; 143 120 9 6]
60, 120	23.56%	23.56%	76.42%	9.45%	[0 0 5 297; 0 0 1 303; 0 0 3 293; 0 0 3 275]
80, 50	22.63%	22.63%	75.09%	14.61%	[0 120 0 182; 0 96 0 208; 0 95 0 201; 0 106 1 171]
80, 100	22.12%	22.12%	75.32%	15.08%	[26 20 25 231; 46 2 30 226; 39 7 29 221; 42 3 29 204]
100, 40	25.0%	25.0%	75.84%	18.54%	[12 20 130 140; 15 4 129 156; 13 3 125 155; 15 4 105 154]

Table: ANN metrics result

Approach 4: Multiclass Classification with data dimensionality reduction

Results: kNN CV

k	Accuracy	Recall	Specificity	F1-Score
1	70.96% (0.02)	70.96% (0.02)	90.3% (0.01)	69.58% (0.02)
2	60.53% (0.02)	60.53% (0.02)	86.85% (0.01)	58.97% (0.02)
3	55.3% (0.02)	55.3% (0.02)	85.1% (0.01)	53.46% (0.02)
5	50.93% (0.01)	50.93% (0.01)	83.65% (0.0)	48.64% (0.02)
7	46.38% (0.01)	46.38% (0.01)	82.14% (0.0)	44.3% (0.02)
10	41.87% (0.02)	41.87% (0.02)	80.63% (0.01)	40.58% (0.02)
15	39.11% (0.03)	39.11% (0.03)	79.71% (0.01)	38.46% (0.03)

Table: kNN metrics result for CrossValidation

Approach 4: Multiclass Classification with data dimensionality reduction

Results: kNN

k	Accuracy	Recall	Specificity	F1-Score	CM
1	70.34%	70.34%	90.17%	68.79%	[302 0 0 0; 25 130 89 60; 13 83 156 44; 6 12 18 242]
2	61.36%	61.36%	87.08%	59.74%	[297 5 0 0; 25 169 50 60; 13 134 81 68; 6 85 10 177]
3	54.58%	54.58%	84.87%	52.79%	[297 5 0 0; 39 110 77 78; 36 92 98 70; 15 80 44 139]
5	50.68%	50.68%	83.61%	48.47%	[281 5 12 4; 53 104 73 74; 49 78 80 89; 28 68 49 133]
7	47.54%	47.54%	82.49%	45.1%	[264 11 20 7; 75 92 66 71; 73 68 78 77; 44 58 49 127]
10	40.42%	40.42%	80.11%	38.67%	[208 39 27 28; 88 86 58 72; 78 71 64 83; 62 58 39 119]
15	35.42%	35.42%	78.47%	34.56%	[157 52 52 41; 86 81 64 73; 77 76 61 82; 51 55 53 119]

Table: kNN metrics result

Approach 4: Multiclass Classification with data dimensionality reduction

Results: Decision Tree CV

MaxDepth	Accuracy	Recall	Specificity	F1-Score
3	29.54% (0.02)	29.54% (0.02)	76.47% (0.01)	25.2% (0.02)
5	33.03% (0.02)	33.03% (0.02)	77.66% (0.01)	29.97% (0.03)
7	36.16% (0.02)	36.16% (0.02)	78.74% (0.01)	34.58% (0.02)
10	45.68% (0.02)	45.68% (0.02)	81.89% (0.01)	44.73% (0.02)
15	59.39% (0.03)	59.39% (0.03)	86.45% (0.01)	58.37% (0.03)
nothing	70.55% (0.03)	70.55% (0.03)	90.17% (0.01)	69.12% (0.03)

Table: Decision Tree metrics result for CrossValidation

Approach 4: Multiclass Classification with data dimensionality reduction

Results: Decision Tree

MaxDepth	Accuracy	Recall	Specificity	F1-Score	CM
3	28.22%	28.22%	76.38%	24.56%	[64 106 4 128; 36 137 4 127; 24 139 7 126; 34 115 4 125]
5	32.37%	32.37%	77.96%	30.92%	[112 37 33 120; 50 83 38 133; 36 85 34 141; 35 62 28 153]
7	35.59%	35.59%	78.81%	34.47%	[160 28 35 79; 73 60 71 100; 64 54 72 106; 50 39 61 128]
10	45.85%	45.85%	81.89%	44.12%	[233 32 6 31; 76 107 58 63; 62 90 74 70; 52 68 31 127]
15	60.68%	60.68%	86.92%	59.9%	[265 17 10 10; 29 125 87 63; 24 81 136 55; 14 44 30 190]
nothing	70.76%	70.76%	90.33%	69.26%	[302 0 0 0; 25 134 88 57; 17 67 161 51; 8 16 16 238]

Table: DecisionTree metrics result

Approach 4: Multiclass Classification with data dimensionality reduction

Results: SVM CV

Kernel	C	Accuracy	Recall	Specificity	F1-Score
rbf	0.1	27.65% (0.02)	27.65% (0.02)	75.97% (0.01)	21.56% (0.02)
rbf	1.0	28.73% (0.02)	28.73% (0.02)	76.31% (0.01)	24.59% (0.02)
rbf	10.0	30.15% (0.02)	30.15% (0.02)	76.75% (0.01)	27.09% (0.02)
poly	0.1	26.19% (0.01)	26.19% (0.01)	74.94% (0.0)	13.41% (0.01)
poly	1.0	26.23% (0.01)	26.23% (0.01)	74.96% (0.0)	13.51% (0.01)
linear	0.1	26.59% (0.02)	26.59% (0.02)	75.63% (0.01)	17.33% (0.02)
linear	1.0	26.59% (0.02)	26.59% (0.02)	75.62% (0.01)	17.32% (0.02)
linear	10.0	26.59% (0.02)	26.59% (0.02)	75.62% (0.01)	17.32% (0.02)

Table: SVM metrics result for CrossValidation

Approach 4: Multiclass Classification with data dimensionality reduction

Results: SVM

Kernel	C	Accuracy	Recall	Specificity	F1-Score	CM
rbf	0.1	28.39%	28.39%	75.76%	22.23%	[51 189 0 62; 23 217 2 62; 23 217 1 55; 42 170 0 66]
rbf	1.0	26.86%	26.86%	75.37%	23.77%	[37 161 38 66; 15 183 42 64; 13 192 34 57; 25 151 39 63]
rbf	10.0	29.66%	29.66%	76.46%	27.31%	[67 132 21 82; 35 167 17 85; 37 161 28 70; 41 127 22 88]
poly	0.1	24.07%	24.07%	76.47%	12.1%	[16 6 0 280; 5 4 2 293; 7 5 1 283; 7 6 2 263]
poly	1.0	24.07%	24.07%	76.47%	12.11%	[16 6 0 280; 5 4 2 293; 7 5 1 283; 6 7 2 263]
linear	0.1	26.61%	26.61%	75.22%	16.94%	[0 220 0 82; 0 234 1 69; 0 235 2 59; 0 200 0 78]
linear	1.0	26.69%	26.69%	75.24%	17.13%	[0 220 0 82; 0 234 2 68; 0 236 3 57; 0 200 0 78]
linear	10.0	26.69%	26.69%	75.24%	17.13%	[0 220 0 82; 0 234 2 68; 0 236 3 57; 0 200 0 78]

Table: SVM metrics result

Approach 4: Multiclass Classification with data dimensionality reduction

Results: Ensembles CV

Ensemble Model	Parameters	Accuracy	Recall	Specificity	F1-Score
Hard Voting		73.41% (0.02)	73.41% (0.02)	91.15% (0.01)	72.32% (0.03)
Stacking (Decision Tree)	Max Depth = None	65.49% (0.01)	65.49% (0.01)	88.5% (0.0)	65.46% (0.01)
Stacking (kNN)	numNeighbors = 1	66.38% (0.02)	66.38% (0.02)	88.8% (0.01)	66.3% (0.02)
Stacking (SVM)	C = 10, kernel = rbf	74.92% (0.02)	74.92% (0.02)	91.67% (0.01)	74.81% (0.02)

Table: Ensemble Model metrics result for CrossValidation

Approach 4: Multiclass Classification with data dimensionality reduction

Conclusion

- Slightly varied outcomes using nearly half the features.
- Reduced training time.



Conclusions and future work

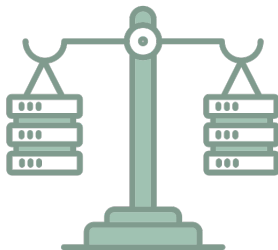
Conclusions



Conclusions



Conclusions



Future work



Future work



