COMP 551

Assignment 2 report

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1.

DS1 train saved to "DS1_train.csv"

DS1 valid saved to "DS1_valid.csv"

DS1 test saved to "DS1_test.csv"

2.1.(a)

Best fit accuracy, recall, precision and F-measure achieved:

accuracy	0.96625		
recall	0.965		
precision	0.9674185463659147		
F-measure	0.9662077596996245		

2.1.(b)

Coefficients reported in "Assignment2_260631276_2_1_b.txt".

3.(a)

K	F-measure	K	F-measure	K	F-measure
1	0.51069	15	0.51758	29	0.50773
3	0.52644	17	0.5	31	0.49150
5	0.51262	19	0.49548	33	0.49424
7	0.50765	21	0.49677	35	0.49742
9	0.50886	23	0.49544	37	0.49215
11	0.49620	25	0.50390	39	
13	0.50375	27	0.49283		

```
k: 1 accuracy: 0.51375 recall: 0.5075, precision: 0.5139240506329114 F1 score: 0.5106918238993711
k: 3 accuracy: 0.53 recall: 0.5225 , precision: 0.5304568527918782 F1 score: 0.5264483627204031
k: 5 accuracy: 0.5175 recall: 0.5075 , precision: 0.5178571428571429 F1 score: 0.5126262626262627
k: 7 accuracy: 0.5175 recall: 0.4975 , precision: 0.5182291666666666 F1 score: 0.5076530612244898
k: 9 accuracy: 0.515 recall: 0.5025 , precision: 0.5153846153846153 F1 score: 0.5088607594936708
k: 11 accuracy: 0.5025 recall: 0.49 , precision: 0.5025641025641026 F1 score: 0.4962025316455696
k: 13 accuracy: 0.505 recall: 0.5025, precision: 0.5050251256281407 F1 score: 0.5037593984962406
k: 15 accuracy: 0.52 recall: 0.515 , precision: 0.52020202020202 F1 score: 0.5175879396984925
k: 17 accuracy: 0.5175 recall: 0.4825 , precision: 0.5188172043010753 F1 score: 0.5
k: 19 accuracy: 0.51125 recall: 0.48, precision: 0.512 F1 score: 0.49548387096774194
k: 21 accuracy: 0.51375 recall: 0.48 , precision: 0.514745308310992 F1 score: 0.49676584734799484
k: 23 accuracy: 0.51625 recall: 0.475 , precision: 0.5177111716621253 F1 score: 0.49543676662320724
k: 25 accuracy: 0.5225 recall: 0.485 , precision: 0.5243243243243 F1 score: 0.503896103896104
k: 27 accuracy: 0.51375 recall: 0.4725 , precision: 0.5149863760217984 F1 score: 0.49282920469361147
k: 29 accuracy: 0.5225 recall: 0.4925 , precision: 0.523936170212766 F1 score: 0.5077319587628866
k: 31 accuracy: 0.51375 recall: 0.47 , precision: 0.5150684931506849 F1 score: 0.4915032679738562
k: 33 accuracy: 0.50625 recall: 0.4825 , precision: 0.5065616797900262 F1 score: 0.4942381562099871
k: 35 accuracy: 0.5125 recall: 0.4825, precision: 0.5132978723404256 F1 score: 0.49742268041237114
k: 37 accuracy: 0.515 recall: 0.47 , precision: 0.5164835164835165 F1 score: 0.49214659685863876
k: 39 accuracy: 0.53 recall: 0.48 , precision: 0.53333333333333 F1 score: 0.505263157894737
```

Based on the F-measure, k-NN classifier performs clearly worse than GDA method.

One possible explanation to this is that the data points in two sets are linearly separable due to their features while we are trying to apply k-NN classifier to get a non-linear boundary of classification.

The best k found by using validation set is 3 this time, although there is no huge difference in F-measure with corresponding k values.

3.(b)

4.

```
DS2 train set saved to "DS2_train.csv"

DS2 valid set saved to "DS2_valid.csv"
```

DS2 test set saved to "DS2_test.csv"

5.1.a

accuracy: 0.45875

recall: 0.45

precision: 0.4580152671755725 F1 score: 0.45397225725094575

accuracy: 0.45875 recall: 0.45 , precision: 0.4580152671755725 F1 score: 0.45397225725094575

5.1.b

Coefficients reported in "Assignment2_260631276_5_1_b.txt".

5.2

K	F-measure	K	F-measure	K	F-measure
1	0.51661	15	0.52774	29	0.49564
3	0.48805	17	0.50428	31	0.49938
5	0.49685	19	0.50801	33	0.50932
7	0.51111	21	0.53580	35	0.51238
9	0.51244	23	0.52410	37	0.51644
11	0.52812	25	0.52891	39	0.52760
13	0.51733	27	0.50860		

Using DS2 dataset, the k-NN classifier perform slightly better than GDA. The best k we can get using DS2 validation set is k=21, although there is no outstanding variation in F-measure as k varies.

The fact that GDA perform badly may suggest that the datasets are not linearly separable.

As for the reason why k-NN classifier also have a bad performance, one possible reason is that the size of training set is not large enough to predict objects with 20 features correctly. Also, the dataset is not normalized so that some features might be dominant than others(which is not intended to be) since they might possess a relatively larger values.

Using k=21, the best fit measurement using test set is:

```
k: 21 accuracy: 0.535
recall: 0.5075
precision: 0.5370370370370371
F1 score: 0.5218508997429305
{'k': 21,
   'accuracy': 0.535,
   'recall': 0.5075,
   'precision': 0.5370370370370371,
   'F1 score': 0.5218508997429305}
```

6.

For GDA approach, the performance drop dramatically as we move from DS1 to DS2 since we generate DS2 data from mixtures of three gaussian distributions, which is not likely to be linearly separable.

For the K-NN classifier, since we do not increase the size of dataset used for training and we do not add weight or normalize the data, the performance of K-NN classifier remains around 0.5 F1 score for both DS1 and DS2.

Both of them do not work well for DS2, but for DS1, GDA performs much better than K-NN classifier since the data is linearly separable.