

# **RESULTS**

## **Part 1**

### ***Earphone***

Cross Validation 1 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 60.0)

('MNB\_classifier accuracy percent:', 63.07692307692307)

('BernoulliNB\_classifier accuracy percent:', 61.53846153846154)

('LogisticRegression\_classifier accuracy percent:', 69.23076923076923)

('LinearSVC\_classifier accuracy percent:', 70.76923076923077)

('voted\_classifier accuracy percent:', 63.07692307692307)

Cross Validation 2 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 74.60317460317461)

('MNB\_classifier accuracy percent:', 73.01587301587301)

('BernoulliNB\_classifier accuracy percent:', 76.19047619047619)

('LogisticRegression\_classifier accuracy percent:', 66.66666666666666)

('LinearSVC\_classifier accuracy percent:', 66.66666666666666)

('voted\_classifier accuracy percent:', 73.01587301587301)

Cross Validation 3 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 58.06451612903226)

('MNB\_classifier accuracy percent:', 56.451612903225815)

('BernoulliNB\_classifier accuracy percent:', 56.451612903225815)

('LogisticRegression\_classifier accuracy percent:', 62.903225806451616)

('LinearSVC\_classifier accuracy percent:', 56.451612903225815)

('voted\_classifier accuracy percent:', 56.451612903225815)

Cross Validation 4 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 68.75)

('MNB\_classifier accuracy percent:', 68.75)

('BernoulliNB\_classifier accuracy percent:', 67.1875)

('LogisticRegression\_classifier accuracy percent:', 64.0625)

('LinearSVC\_classifier accuracy percent:', 67.1875)

('voted\_classifier accuracy percent:', 68.75)

Cross Validation 5 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 63.63636363636363)

('MNB\_classifier accuracy percent:', 59.09090909090909)

('BernoulliNB\_classifier accuracy percent:', 59.09090909090909)

('LogisticRegression\_classifier accuracy percent:', 60.60606060606061)

('LinearSVC\_classifier accuracy percent:', 59.09090909090909)

('voted\_classifier accuracy percent:', 62.121212121212125)

Cross Validation 6 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 61.53846153846154)

('MNB\_classifier accuracy percent:', 64.61538461538461)

('BernoulliNB\_classifier accuracy percent:', 63.07692307692307)

('LogisticRegression\_classifier accuracy percent:', 64.61538461538461)

('LinearSVC\_classifier accuracy percent:', 70.76923076923077)

('voted\_classifier accuracy percent:', 66.15384615384615)

Cross Validation 7 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 53.96825396825397)

('MNB\_classifier accuracy percent:', 53.96825396825397)

('BernoulliNB\_classifier accuracy percent:', 52.38095238095239)  
 ('LogisticRegression\_classifier accuracy percent:', 57.14285714285714)  
 ('LinearSVC\_classifier accuracy percent:', 52.38095238095239)  
 ('voted\_classifier accuracy percent:', 52.38095238095239)  
 Cross Validation 8 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 56.060606060606055)  
 ('MNB\_classifier accuracy percent:', 59.09090909090909)  
 ('BernoulliNB\_classifier accuracy percent:', 60.60606060606061)  
 ('LogisticRegression\_classifier accuracy percent:', 63.63636363636363)  
 ('LinearSVC\_classifier accuracy percent:', 66.66666666666666)  
 ('voted\_classifier accuracy percent:', 59.09090909090909)  
 Cross Validation 9 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 66.15384615384615)  
 ('MNB\_classifier accuracy percent:', 64.61538461538461)  
 ('BernoulliNB\_classifier accuracy percent:', 60.0)  
 ('LogisticRegression\_classifier accuracy percent:', 58.46153846153847)  
 ('LinearSVC\_classifier accuracy percent:', 55.38461538461539)  
 ('voted\_classifier accuracy percent:', 63.07692307692307)  
 Cross Validation 10 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 69.6969696969697)  
 ('MNB\_classifier accuracy percent:', 68.18181818181817)  
 ('BernoulliNB\_classifier accuracy percent:', 63.63636363636363)  
 ('LogisticRegression\_classifier accuracy percent:', 59.09090909090909)  
 ('LinearSVC\_classifier accuracy percent:', 62.121212121212125)  
 ('voted\_classifier accuracy percent:', 63.63636363636363)  
 ('Average Original Naive Bayes Algo accuracy percent using high frequency words:', 63.2472191786708)  
 ('Average MNB\_classifier accuracy percent:', 63.085706855868146)  
 ('Average BernoulliNB\_classifier accuracy percent:', 62.01592594233724)  
 ('Average LogisticRegression\_classifier accuracy percent:', 62.64162752570011)  
 ('Average LinearSVC\_classifier accuracy percent:', 62.748859675270964)  
 ('Average voted\_classifier accuracy percent:', 62.77546154562284)

## ***GPS***

Cross Validation 1 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 72.08121827411168)  
 ('MNB\_classifier accuracy percent:', 77.15736040609137)  
 ('BernoulliNB\_classifier accuracy percent:', 75.63451776649747)  
 ('LogisticRegression\_classifier accuracy percent:', 80.20304568527918)  
 ('LinearSVC\_classifier accuracy percent:', 77.66497461928934)  
 ('voted\_classifier accuracy percent:', 77.66497461928934)  
 Cross Validation 2 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 77.61194029850746)  
 ('MNB\_classifier accuracy percent:', 75.62189054726367)  
 ('BernoulliNB\_classifier accuracy percent:', 74.12935323383084)  
 ('LogisticRegression\_classifier accuracy percent:', 83.08457711442786)  
 ('LinearSVC\_classifier accuracy percent:', 78.60696517412936)  
 ('voted\_classifier accuracy percent:', 80.09950248756219)  
 Cross Validation 3 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 76.80412371134021)  
(('MNB\_classifier accuracy percent:', 73.19587628865979)  
(('BernoulliNB\_classifier accuracy percent:', 70.10309278350515)  
(('LogisticRegression\_classifier accuracy percent:', 80.9278350515464)  
(('LinearSVC\_classifier accuracy percent:', 82.4742268041237)  
(('voted\_classifier accuracy percent:', 77.31958762886599)  
Cross Validation 4 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 77.41935483870968)  
(('MNB\_classifier accuracy percent:', 80.64516129032258)  
(('BernoulliNB\_classifier accuracy percent:', 79.56989247311827)  
(('LogisticRegression\_classifier accuracy percent:', 87.09677419354838)  
(('LinearSVC\_classifier accuracy percent:', 87.09677419354838)  
(('voted\_classifier accuracy percent:', 83.33333333333334)  
Cross Validation 5 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 81.91489361702128)  
(('MNB\_classifier accuracy percent:', 82.97872340425532)  
(('BernoulliNB\_classifier accuracy percent:', 81.91489361702128)  
(('LogisticRegression\_classifier accuracy percent:', 85.63829787234043)  
(('LinearSVC\_classifier accuracy percent:', 82.97872340425532)  
(('voted\_classifier accuracy percent:', 85.1063829787234)  
Cross Validation 6 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 74.73684210526315)  
(('MNB\_classifier accuracy percent:', 77.36842105263158)  
(('BernoulliNB\_classifier accuracy percent:', 75.26315789473685)  
(('LogisticRegression\_classifier accuracy percent:', 81.57894736842105)  
(('LinearSVC\_classifier accuracy percent:', 78.94736842105263)  
(('voted\_classifier accuracy percent:', 76.84210526315789)  
Cross Validation 7 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 72.91666666666666)  
(('MNB\_classifier accuracy percent:', 79.16666666666666)  
(('BernoulliNB\_classifier accuracy percent:', 76.5625)  
(('LogisticRegression\_classifier accuracy percent:', 80.72916666666666)  
(('LinearSVC\_classifier accuracy percent:', 79.16666666666666)  
(('voted\_classifier accuracy percent:', 77.08333333333334)  
Cross Validation 8 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 74.27184466019418)  
(('MNB\_classifier accuracy percent:', 80.58252427184466)  
(('BernoulliNB\_classifier accuracy percent:', 77.66990291262135)  
(('LogisticRegression\_classifier accuracy percent:', 80.09708737864078)  
(('LinearSVC\_classifier accuracy percent:', 80.58252427184466)  
(('voted\_classifier accuracy percent:', 80.58252427184466)  
Cross Validation 9 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 75.26315789473685)  
(('MNB\_classifier accuracy percent:', 75.78947368421053)  
(('BernoulliNB\_classifier accuracy percent:', 74.73684210526315)  
(('LogisticRegression\_classifier accuracy percent:', 82.63157894736842)  
(('LinearSVC\_classifier accuracy percent:', 80.0)  
(('voted\_classifier accuracy percent:', 80.0)  
Cross Validation 10 / 10  
(('Original Naive Bayes Algo accuracy percent using high frequency words:', 67.95580110497238)  
(('MNB\_classifier accuracy percent:', 68.50828729281768)

('BernoulliNB\_classifier accuracy percent:', 69.06077348066299)  
('LogisticRegression\_classifier accuracy percent:', 74.03314917127072)  
('LinearSVC\_classifier accuracy percent:', 71.8232044198895)  
('voted\_classifier accuracy percent:', 71.27071823204419)  
('Average Original Naive Bayes Algo accuracy percent using high frequency words:',  
75.09758431715235)  
('Average MNB\_classifier accuracy percent:', 77.1014384904764)  
('Average BernoulliNB\_classifier accuracy percent:', 75.46449262672573)  
('Average LogisticRegression\_classifier accuracy percent:', 81.60204594495099)  
('Average LinearSVC\_classifier accuracy percent:', 79.93414279747995)  
('Average voted\_classifier accuracy percent:', 78.93024621481543)

## ***Keyboard***

python Part1.py

Cross Validation 1 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 65.94202898550725)  
('MNB\_classifier accuracy percent:', 66.66666666666666)  
('BernoulliNB\_classifier accuracy percent:', 64.4927536231884)  
('LogisticRegression\_classifier accuracy percent:', 74.63768115942028)  
('LinearSVC\_classifier accuracy percent:', 72.46376811594203)  
('voted\_classifier accuracy percent:', 66.66666666666666)

Cross Validation 2 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 71.73913043478261)  
('MNB\_classifier accuracy percent:', 71.01449275362319)  
('BernoulliNB\_classifier accuracy percent:', 71.01449275362319)  
('LogisticRegression\_classifier accuracy percent:', 76.08695652173914)  
('LinearSVC\_classifier accuracy percent:', 72.46376811594203)  
('voted\_classifier accuracy percent:', 71.73913043478261)

Cross Validation 3 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 65.44117647058823)  
('MNB\_classifier accuracy percent:', 66.91176470588235)  
('BernoulliNB\_classifier accuracy percent:', 65.44117647058823)  
('LogisticRegression\_classifier accuracy percent:', 69.11764705882352)  
('LinearSVC\_classifier accuracy percent:', 72.05882352941177)  
('voted\_classifier accuracy percent:', 67.64705882352942)

Cross Validation 4 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 69.34306569343066)  
('MNB\_classifier accuracy percent:', 66.42335766423358)  
('BernoulliNB\_classifier accuracy percent:', 66.42335766423358)  
('LogisticRegression\_classifier accuracy percent:', 75.18248175182481)  
('LinearSVC\_classifier accuracy percent:', 75.18248175182481)  
('voted\_classifier accuracy percent:', 67.88321167883211)

Cross Validation 5 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 73.91304347826086)  
('MNB\_classifier accuracy percent:', 73.18840579710145)  
('BernoulliNB\_classifier accuracy percent:', 73.91304347826086)  
('LogisticRegression\_classifier accuracy percent:', 74.63768115942028)  
('LinearSVC\_classifier accuracy percent:', 72.46376811594203)

('voted\_classifier accuracy percent:', 73.91304347826086)  
 Cross Validation 6 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 67.22689075630252)  
 ('MNB\_classifier accuracy percent:', 67.22689075630252)  
 ('BernoulliNB\_classifier accuracy percent:', 65.54621848739495)  
 ('LogisticRegression\_classifier accuracy percent:', 66.38655462184873)  
 ('LinearSVC\_classifier accuracy percent:', 67.22689075630252)  
 ('voted\_classifier accuracy percent:', 67.22689075630252)  
 Cross Validation 7 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 67.6056338028169)  
 ('MNB\_classifier accuracy percent:', 64.7887323943662)  
 ('BernoulliNB\_classifier accuracy percent:', 66.19718309859155)  
 ('LogisticRegression\_classifier accuracy percent:', 66.19718309859155)  
 ('LinearSVC\_classifier accuracy percent:', 64.7887323943662)  
 ('voted\_classifier accuracy percent:', 67.6056338028169)  
 Cross Validation 8 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 68.11594202898551)  
 ('MNB\_classifier accuracy percent:', 68.11594202898551)  
 ('BernoulliNB\_classifier accuracy percent:', 66.66666666666666)  
 ('LogisticRegression\_classifier accuracy percent:', 73.91304347826086)  
 ('LinearSVC\_classifier accuracy percent:', 71.01449275362319)  
 ('voted\_classifier accuracy percent:', 66.66666666666666)  
 Cross Validation 9 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 70.0)  
 ('MNB\_classifier accuracy percent:', 70.83333333333334)  
 ('BernoulliNB\_classifier accuracy percent:', 70.0)  
 ('LogisticRegression\_classifier accuracy percent:', 70.83333333333334)  
 ('LinearSVC\_classifier accuracy percent:', 68.33333333333333)  
 ('voted\_classifier accuracy percent:', 70.0)  
 Cross Validation 10 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 71.01449275362319)  
 ('MNB\_classifier accuracy percent:', 71.73913043478261)  
 ('BernoulliNB\_classifier accuracy percent:', 70.28985507246377)  
 ('LogisticRegression\_classifier accuracy percent:', 73.18840579710145)  
 ('LinearSVC\_classifier accuracy percent:', 73.91304347826086)  
 ('voted\_classifier accuracy percent:', 71.01449275362319)  
 ('Average Original Naive Bayes Algo accuracy percent using high frequency words:',  
 69.03414044042977)  
 ('Average MNB\_classifier accuracy percent:', 68.69087165352775)  
 ('Average BernoulliNB\_classifier accuracy percent:', 67.99847473150112)  
 ('Average LogisticRegression\_classifier accuracy percent:', 72.0180967980364)  
 ('Average LinearSVC\_classifier accuracy percent:', 70.99091023449489)  
 ('Average voted\_classifier accuracy percent:', 69.03627950614809)

## ***Mouse***

Cross Validation 1 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 72.58064516129032)  
 ('MNB\_classifier accuracy percent:', 82.66129032258065)

('BernoulliNB\_classifier accuracy percent:', 83.06451612903226)  
('LogisticRegression\_classifier accuracy percent:', 87.90322580645162)  
('LinearSVC\_classifier accuracy percent:', 85.48387096774194)  
('voted\_classifier accuracy percent:', 85.48387096774194)  
Cross Validation 2 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 71.37096774193549)  
('MNB\_classifier accuracy percent:', 78.62903225806451)  
('BernoulliNB\_classifier accuracy percent:', 79.03225806451613)  
('LogisticRegression\_classifier accuracy percent:', 84.2741935483871)  
('LinearSVC\_classifier accuracy percent:', 81.04838709677419)  
('voted\_classifier accuracy percent:', 79.83870967741935)  
Cross Validation 3 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 77.82258064516128)  
('MNB\_classifier accuracy percent:', 79.43548387096774)  
('BernoulliNB\_classifier accuracy percent:', 78.62903225806451)  
('LogisticRegression\_classifier accuracy percent:', 84.2741935483871)  
('LinearSVC\_classifier accuracy percent:', 81.45161290322581)  
('voted\_classifier accuracy percent:', 81.45161290322581)  
Cross Validation 4 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 81.78137651821862)  
('MNB\_classifier accuracy percent:', 83.40080971659918)  
('BernoulliNB\_classifier accuracy percent:', 82.5910931174089)  
('LogisticRegression\_classifier accuracy percent:', 85.02024291497976)  
('LinearSVC\_classifier accuracy percent:', 82.5910931174089)  
('voted\_classifier accuracy percent:', 85.02024291497976)  
Cross Validation 5 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 76.11336032388664)  
('MNB\_classifier accuracy percent:', 85.02024291497976)  
('BernoulliNB\_classifier accuracy percent:', 85.82995951417004)  
('LogisticRegression\_classifier accuracy percent:', 83.40080971659918)  
('LinearSVC\_classifier accuracy percent:', 83.40080971659918)  
('voted\_classifier accuracy percent:', 85.02024291497976)  
Cross Validation 6 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 80.64516129032258)  
('MNB\_classifier accuracy percent:', 85.48387096774194)  
('BernoulliNB\_classifier accuracy percent:', 83.06451612903226)  
('LogisticRegression\_classifier accuracy percent:', 88.30645161290323)  
('LinearSVC\_classifier accuracy percent:', 85.08064516129032)  
('voted\_classifier accuracy percent:', 87.90322580645162)  
Cross Validation 7 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 77.8688524590164)  
('MNB\_classifier accuracy percent:', 80.32786885245902)  
('BernoulliNB\_classifier accuracy percent:', 79.91803278688525)  
('LogisticRegression\_classifier accuracy percent:', 83.60655737704919)  
('LinearSVC\_classifier accuracy percent:', 79.09836065573771)  
('voted\_classifier accuracy percent:', 81.9672131147541)  
Cross Validation 8 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 75.0)  
('MNB\_classifier accuracy percent:', 84.8360655737705)  
('BernoulliNB\_classifier accuracy percent:', 83.60655737704919)  
('LogisticRegression\_classifier accuracy percent:', 85.65573770491804)

('LinearSVC\_classifier accuracy percent:', 83.19672131147541)  
('voted\_classifier accuracy percent:', 86.0655737704918)  
Cross Validation 9 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 72.15189873417721)  
('MNB\_classifier accuracy percent:', 81.43459915611815)  
('BernoulliNB\_classifier accuracy percent:', 81.0126582278481)  
('LogisticRegression\_classifier accuracy percent:', 81.0126582278481)  
('LinearSVC\_classifier accuracy percent:', 75.9493670886076)  
('voted\_classifier accuracy percent:', 79.74683544303798)  
Cross Validation 10 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 75.6198347107438)  
('MNB\_classifier accuracy percent:', 85.53719008264463)  
('BernoulliNB\_classifier accuracy percent:', 86.36363636363636)  
('LogisticRegression\_classifier accuracy percent:', 83.47107438016529)  
('LinearSVC\_classifier accuracy percent:', 82.64462809917356)  
('voted\_classifier accuracy percent:', 84.29752066115702)  
('Average Original Naive Bayes Algo accuracy percent using high frequency words:',  
76.09546775847522)  
('Average MNB\_classifier accuracy percent:', 82.67664537159261)  
('Average BernoulliNB\_classifier accuracy percent:', 82.3112259967643)  
('Average LogisticRegression\_classifier accuracy percent:', 84.69251448376886)  
('Average LinearSVC\_classifier accuracy percent:', 81.99454961180346)  
('Average voted\_classifier accuracy percent:', 83.67950481742392)

## ***MP3 Player***

Cross Validation 1 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 79.41176470588235)  
('MNB\_classifier accuracy percent:', 76.47058823529412)  
('BernoulliNB\_classifier accuracy percent:', 76.47058823529412)  
('LogisticRegression\_classifier accuracy percent:', 64.70588235294117)  
('LinearSVC\_classifier accuracy percent:', 64.70588235294117)  
('voted\_classifier accuracy percent:', 76.47058823529412)  
Cross Validation 2 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 79.41176470588235)  
('MNB\_classifier accuracy percent:', 79.41176470588235)  
('BernoulliNB\_classifier accuracy percent:', 79.41176470588235)  
('LogisticRegression\_classifier accuracy percent:', 79.41176470588235)  
('LinearSVC\_classifier accuracy percent:', 82.35294117647058)  
('voted\_classifier accuracy percent:', 79.41176470588235)  
Cross Validation 3 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 79.41176470588235)  
('MNB\_classifier accuracy percent:', 82.35294117647058)  
('BernoulliNB\_classifier accuracy percent:', 82.35294117647058)  
('LogisticRegression\_classifier accuracy percent:', 85.29411764705883)  
('LinearSVC\_classifier accuracy percent:', 88.23529411764706)  
('voted\_classifier accuracy percent:', 79.41176470588235)  
Cross Validation 4 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 76.47058823529412)  
('MNB\_classifier accuracy percent:', 79.41176470588235)

('BernoulliNB\_classifier accuracy percent:', 79.41176470588235)  
('LogisticRegression\_classifier accuracy percent:', 76.47058823529412)  
('LinearSVC\_classifier accuracy percent:', 76.47058823529412)  
('voted\_classifier accuracy percent:', 79.41176470588235)  
Cross Validation 5 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 73.52941176470588)  
('MNB\_classifier accuracy percent:', 73.52941176470588)  
('BernoulliNB\_classifier accuracy percent:', 73.52941176470588)  
('LogisticRegression\_classifier accuracy percent:', 70.58823529411765)  
('LinearSVC\_classifier accuracy percent:', 55.88235294117647)  
('voted\_classifier accuracy percent:', 73.52941176470588)  
Cross Validation 6 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 52.94117647058824)  
('MNB\_classifier accuracy percent:', 52.94117647058824)  
('BernoulliNB\_classifier accuracy percent:', 55.88235294117647)  
('LogisticRegression\_classifier accuracy percent:', 50.0)  
('LinearSVC\_classifier accuracy percent:', 47.05882352941176)  
('voted\_classifier accuracy percent:', 52.94117647058824)  
Cross Validation 7 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 56.25)  
('MNB\_classifier accuracy percent:', 43.75)  
('BernoulliNB\_classifier accuracy percent:', 46.875)  
('LogisticRegression\_classifier accuracy percent:', 56.25)  
('LinearSVC\_classifier accuracy percent:', 53.125)  
('voted\_classifier accuracy percent:', 50.0)  
Cross Validation 8 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 58.06451612903226)  
('MNB\_classifier accuracy percent:', 58.06451612903226)  
('BernoulliNB\_classifier accuracy percent:', 58.06451612903226)  
('LogisticRegression\_classifier accuracy percent:', 51.61290322580645)  
('LinearSVC\_classifier accuracy percent:', 58.06451612903226)  
('voted\_classifier accuracy percent:', 58.06451612903226)  
Cross Validation 9 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 60.60606060606061)  
('MNB\_classifier accuracy percent:', 60.60606060606061)  
('BernoulliNB\_classifier accuracy percent:', 60.60606060606061)  
('LogisticRegression\_classifier accuracy percent:', 51.515151515151516)  
('LinearSVC\_classifier accuracy percent:', 54.54545454545454)  
('voted\_classifier accuracy percent:', 57.57575757575758)  
Cross Validation 10 / 10  
('Original Naive Bayes Algo accuracy percent using high frequency words:', 71.875)  
('MNB\_classifier accuracy percent:', 71.875)  
('BernoulliNB\_classifier accuracy percent:', 65.625)  
('LogisticRegression\_classifier accuracy percent:', 68.75)  
('LinearSVC\_classifier accuracy percent:', 56.25)  
('voted\_classifier accuracy percent:', 68.75)  
('Average Original Naive Bayes Algo accuracy percent using high frequency words:',  
68.79720473233282)  
('Average MNB\_classifier accuracy percent:', 67.84132237939164)  
('Average BernoulliNB\_classifier accuracy percent:', 67.82294002645047)  
('Average LogisticRegression\_classifier accuracy percent:', 65.45986429762522)



('Average LinearSVC\_classifier accuracy percent:', 63.66908530274279)  
('Average voted\_classifier accuracy percent:', 67.55667442930252)

## ***Router***

### Cross Validation 1 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 63.25301204819277)  
('MNB\_classifier accuracy percent:', 73.29317269076306)  
('BernoulliNB\_classifier accuracy percent:', 73.69477911646585)  
('LogisticRegression\_classifier accuracy percent:', 76.90763052208835)  
('LinearSVC\_classifier accuracy percent:', 78.714859437751)  
('voted\_classifier accuracy percent:', 73.89558232931726)

### Cross Validation 2 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 77.66599597585513)  
('MNB\_classifier accuracy percent:', 82.29376257545272)  
('BernoulliNB\_classifier accuracy percent:', 81.89134808853119)  
('LogisticRegression\_classifier accuracy percent:', 82.897384305835)  
('LinearSVC\_classifier accuracy percent:', 80.28169014084507)  
('voted\_classifier accuracy percent:', 83.90342052313883)

### Cross Validation 3 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 82.25806451612904)  
('MNB\_classifier accuracy percent:', 85.08064516129032)  
('BernoulliNB\_classifier accuracy percent:', 83.87096774193549)  
('LogisticRegression\_classifier accuracy percent:', 86.69354838709677)  
('LinearSVC\_classifier accuracy percent:', 83.46774193548387)  
('voted\_classifier accuracy percent:', 85.08064516129032)

### Cross Validation 4 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 84.50704225352112)  
('MNB\_classifier accuracy percent:', 85.91549295774648)  
('BernoulliNB\_classifier accuracy percent:', 85.91549295774648)  
('LogisticRegression\_classifier accuracy percent:', 86.31790744466801)  
('LinearSVC\_classifier accuracy percent:', 83.90342052313883)  
('voted\_classifier accuracy percent:', 86.31790744466801)

### Cross Validation 5 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 57.31462925851704)  
('MNB\_classifier accuracy percent:', 65.13026052104209)  
('BernoulliNB\_classifier accuracy percent:', 66.33266533066133)  
('LogisticRegression\_classifier accuracy percent:', 58.717434869739485)  
('LinearSVC\_classifier accuracy percent:', 59.118236472945895)  
('voted\_classifier accuracy percent:', 62.32464929859719)

### Cross Validation 6 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 81.17408906882592)  
('MNB\_classifier accuracy percent:', 81.37651821862349)  
('BernoulliNB\_classifier accuracy percent:', 80.5668016194332)  
('LogisticRegression\_classifier accuracy percent:', 81.9838056680162)  
('LinearSVC\_classifier accuracy percent:', 80.97165991902834)  
('voted\_classifier accuracy percent:', 83.19838056680162)

### Cross Validation 7 / 10

('Original Naive Bayes Algo accuracy percent using high frequency words:', 80.28169014084507)  
('MNB\_classifier accuracy percent:', 79.47686116700201)

('BernoulliNB\_classifier accuracy percent:', 78.4708249496982)  
 ('LogisticRegression\_classifier accuracy percent:', 79.67806841046277)  
 ('LinearSVC\_classifier accuracy percent:', 79.27565392354124)  
 ('voted\_classifier accuracy percent:', 79.67806841046277)  
 Cross Validation 8 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 81.83673469387756)  
 ('MNB\_classifier accuracy percent:', 81.22448979591836)  
 ('BernoulliNB\_classifier accuracy percent:', 80.61224489795919)  
 ('LogisticRegression\_classifier accuracy percent:', 82.85714285714286)  
 ('LinearSVC\_classifier accuracy percent:', 81.0204081632653)  
 ('voted\_classifier accuracy percent:', 81.63265306122449)  
 Cross Validation 9 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 82.07739307535643)  
 ('MNB\_classifier accuracy percent:', 82.07739307535643)  
 ('BernoulliNB\_classifier accuracy percent:', 80.04073319755601)  
 ('LogisticRegression\_classifier accuracy percent:', 84.72505091649694)  
 ('LinearSVC\_classifier accuracy percent:', 82.89205702647658)  
 ('voted\_classifier accuracy percent:', 82.68839103869654)  
 Cross Validation 10 / 10  
 ('Original Naive Bayes Algo accuracy percent using high frequency words:', 82.897384305835)  
 ('MNB\_classifier accuracy percent:', 82.09255533199196)  
 ('BernoulliNB\_classifier accuracy percent:', 80.48289738430584)  
 ('LogisticRegression\_classifier accuracy percent:', 80.88531187122736)  
 ('LinearSVC\_classifier accuracy percent:', 82.09255533199196)  
 ('voted\_classifier accuracy percent:', 82.09255533199196)  
 ('Average Original Naive Bayes Algo accuracy percent using high frequency words:',  
 77.32660353369552)  
 ('Average MNB\_classifier accuracy percent:', 79.79611514951868)  
 ('Average BernoulliNB\_classifier accuracy percent:', 79.18787552842927)  
 ('Average LogisticRegression\_classifier accuracy percent:', 80.16632852527736)  
 ('Average LinearSVC\_classifier accuracy percent:', 79.17382828744681)  
 ('Average voted\_classifier accuracy percent:', 80.0812253166189)

### ***Accuracy Part1***

Algorithm\Product	Earphone	GPS	Keyboard	Mouse	MP3 Player	Router
Naive Bayes	63.24	75.097	69.034	76.095	68.79	77.32
MNB_classifier	63.085	77.101	68.69	82.87	67.84	79.76
BernoulliNB	62.015	75.46	67.99	82.31	67.82	79.18
LogisticRegression	62.64	81.60	72.01	84.69	65.45	80.16
LinearSVC	62.74	79.93	70.99	81.99	63.66	79.17
voted_classifier	62.77	78.93	69.03	83.67	67.55	80.081

## **Part 2**

### ***Earphone***

#### **L-BFGS with L1/L2 regularization**

Holdout group: 1

\*\*\*\*\* Iteration #250 \*\*\*\*\*

Loss: 115.723560

Feature norm: 8.089360

Error norm: 0.611706

Active features: 1781192

Line search trials: 1

Line search step: 1.000000

Seconds required for this iteration: 1.410

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (1836, 1943, 1844) (0.9449, 0.9957, 0.9696)

B: (11, 13, 37) (0.8462, 0.2973, 0.4400)

I: (35, 41, 116) (0.8537, 0.3017, 0.4459)

Macro-average precision, recall, F1: (0.881581, 0.531561, 0.618498)

Item accuracy: 1882 / 1997 (0.9424)

Instance accuracy: 40 / 68 (0.5882)

Holdout group: 2

\*\*\*\*\* Iteration #246 \*\*\*\*\*

Loss: 111.532077

Feature norm: 8.100101

Error norm: 0.459563

Active features: 1770844

Line search trials: 1

Line search step: 1.000000

Seconds required for this iteration: 0.949

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (1827, 1919, 1856) (0.9521, 0.9844, 0.9679)

B: (12, 17, 34) (0.7059, 0.3529, 0.4706)

I: (44, 69, 115) (0.6377, 0.3826, 0.4783)

Macro-average precision, recall, F1: (0.765207, 0.573308, 0.638932)

Item accuracy: 1883 / 2005 (0.9392)

Instance accuracy: 41 / 68 (0.6029)

Holdout group: 3

\*\*\*\*\* Iteration #274 \*\*\*\*\*

Loss: 117.496869

Feature norm: 8.074770

Error norm: 0.799070

Active features: 1801077

Line search trials: 2

Line search step: 0.447981

Seconds required for this iteration: 2.261

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (1484, 1571, 1492) (0.9446, 0.9946, 0.9690)

B: (13, 15, 32) (0.8667, 0.4062, 0.5532)

I: (32, 38, 100) (0.8421, 0.3200, 0.4638)  
Macro-average precision, recall, F1: (0.884464, 0.573629, 0.661981)  
Item accuracy: 1529 / 1624 (0.9415)  
Instance accuracy: 45 / 68 (0.6618)

Holdout group: 4

\*\*\*\*\* Iteration #243 \*\*\*\*\*

Loss: 110.051090  
Feature norm: 8.106986  
Error norm: 0.556050  
Active features: 1784417  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.286  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1678, 1785, 1695) (0.9401, 0.9900, 0.9644)  
B: (7, 10, 34) (0.7000, 0.2059, 0.3182)  
I: (19, 34, 100) (0.5588, 0.1900, 0.2836)  
Macro-average precision, recall, F1: (0.732960, 0.461951, 0.522044)  
Item accuracy: 1704 / 1829 (0.9317)  
Instance accuracy: 38 / 68 (0.5588)

Holdout group: 5

\*\*\*\*\* Iteration #279 \*\*\*\*\*

Loss: 115.075727  
Feature norm: 8.096623  
Error norm: 1.576471  
Active features: 1780801  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.530  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1712, 1825, 1726) (0.9381, 0.9919, 0.9642)  
B: (4, 7, 33) (0.5714, 0.1212, 0.2000)  
I: (12, 23, 96) (0.5217, 0.1250, 0.2017)  
Macro-average precision, recall, F1: (0.677083, 0.412700, 0.455305)  
Item accuracy: 1728 / 1855 (0.9315)  
Instance accuracy: 35 / 68 (0.5147)

Holdout group: 6

\*\*\*\*\* Iteration #266 \*\*\*\*\*

Loss: 108.541841  
Feature norm: 8.086395  
Error norm: 1.178635  
Active features: 1795870  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.631  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1666, 1775, 1705) (0.9386, 0.9771, 0.9575)

B: (12, 22, 37) (0.5455, 0.3243, 0.4068)  
I: (42, 73, 128) (0.5753, 0.3281, 0.4179)  
Macro-average precision, recall, F1: (0.686463, 0.543192, 0.594054)  
Item accuracy: 1720 / 1870 (0.9198)  
Instance accuracy: 39 / 68 (0.5735)

Holdout group: 7

\*\*\*\*\* Iteration #277 \*\*\*\*\*

Loss: 114.238202  
Feature norm: 8.131193  
Error norm: 1.154696  
Active features: 1790273  
Line search trials: 2  
Line search step: 0.234060  
Seconds required for this iteration: 3.058  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1642, 1712, 1652) (0.9591, 0.9939, 0.9762)  
B: (10, 14, 29) (0.7143, 0.3448, 0.4651)  
I: (33, 41, 86) (0.8049, 0.3837, 0.5197)  
Macro-average precision, recall, F1: (0.826092, 0.574165, 0.653673)  
Item accuracy: 1685 / 1767 (0.9536)  
Instance accuracy: 44 / 67 (0.6567)

Holdout group: 8

\*\*\*\*\* Iteration #248 \*\*\*\*\*

Loss: 107.064829  
Feature norm: 8.031242  
Error norm: 1.855535  
Active features: 1783298  
Line search trials: 2  
Line search step: 0.218725  
Seconds required for this iteration: 3.409  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1678, 1781, 1694) (0.9422, 0.9906, 0.9658)  
B: (12, 17, 38) (0.7059, 0.3158, 0.4364)  
I: (37, 49, 115) (0.7551, 0.3217, 0.4512)  
Macro-average precision, recall, F1: (0.801051, 0.542695, 0.617780)  
Item accuracy: 1727 / 1847 (0.9350)  
Instance accuracy: 36 / 67 (0.5373)

Holdout group: 9

\*\*\*\*\* Iteration #246 \*\*\*\*\*

Loss: 102.637964  
Feature norm: 7.991669  
Error norm: 0.441777  
Active features: 1782260  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.840  
Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (1673, 1812, 1689) (0.9233, 0.9905, 0.9557)  
B: (12, 16, 44) (0.7500, 0.2727, 0.4000)  
I: (36, 50, 145) (0.7200, 0.2483, 0.3692)  
Macro-average precision, recall, F1: (0.797763, 0.503843, 0.574986)  
Item accuracy: 1721 / 1878 (0.9164)  
Instance accuracy: 32 / 67 (0.4776)

Holdout group: 10  
\*\*\*\*\* Iteration #295 \*\*\*\*\*  
Loss: 116.176030  
Feature norm: 8.079505  
Error norm: 1.216295  
Active features: 1786872  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.783  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1541, 1660, 1545) (0.9283, 0.9974, 0.9616)  
B: (10, 12, 42) (0.8333, 0.2381, 0.3704)  
I: (32, 36, 121) (0.8889, 0.2645, 0.4076)  
Macro-average precision, recall, F1: (0.883512, 0.499990, 0.579879)  
Item accuracy: 1583 / 1708 (0.9268)  
Instance accuracy: 34 / 67 (0.5075)

### ***SGD with L2-regularization***

Holdout group: 1  
\*\*\*\*\* Epoch #30 \*\*\*\*\*  
Loss: 178.853454  
Improvement ratio: -0.028070  
Feature L2-norm: 6.482796  
Learning rate (eta): 0.001429  
Total number of feature updates: 9690  
Seconds required for this iteration: 0.735  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (745, 832, 756) (0.8954, 0.9854, 0.9383)  
B: (17, 21, 36) (0.8095, 0.4722, 0.5965)  
I: (49, 58, 119) (0.8448, 0.4118, 0.5537)  
Macro-average precision, recall, F1: (0.849928, 0.623146, 0.696150)  
Item accuracy: 811 / 911 (0.8902)  
Instance accuracy: 14 / 36 (0.3889)

Holdout group: 2  
\*\*\*\*\* Epoch #30 \*\*\*\*\*  
Loss: 178.853454  
Improvement ratio: -0.028070  
Feature L2-norm: 6.482796  
Learning rate (eta): 0.001429  
Total number of feature updates: 9690  
Seconds required for this iteration: 0.735  
Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (745, 832, 756) (0.8954, 0.9854, 0.9383)  
B: (17, 21, 36) (0.8095, 0.4722, 0.5965)  
I: (49, 58, 119) (0.8448, 0.4118, 0.5537)  
Macro-average precision, recall, F1: (0.849928, 0.623146, 0.696150)  
Item accuracy: 811 / 911 (0.8902)  
Instance accuracy: 14 / 36 (0.3889)

Holdout group: 3

\*\*\*\*\* Epoch #30 \*\*\*\*\*

Loss: 158.230295

Improvement ratio: -0.053860

Feature L2-norm: 6.459961

Learning rate (eta): 0.001429

Total number of feature updates: 9690

Seconds required for this iteration: 0.636

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (884, 924, 907) (0.9567, 0.9746, 0.9656)

B: (25, 29, 36) (0.8621, 0.6944, 0.7692)

I: (69, 90, 100) (0.7667, 0.6900, 0.7263)

Macro-average precision, recall, F1: (0.861815, 0.786362, 0.820380)

Item accuracy: 978 / 1043 (0.9377)

Instance accuracy: 18 / 36 (0.5000)

Holdout group: 4

\*\*\*\*\* Epoch #34 \*\*\*\*\*

Loss: 186.919494

Improvement ratio: -0.012375

Feature L2-norm: 6.614265

Learning rate (eta): 0.001412

Total number of feature updates: 10982

Seconds required for this iteration: 0.755

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (739, 814, 753) (0.9079, 0.9814, 0.9432)

B: (20, 26, 36) (0.7692, 0.5556, 0.6452)

I: (50, 62, 113) (0.8065, 0.4425, 0.5714)

Macro-average precision, recall, F1: (0.827848, 0.659814, 0.719931)

Item accuracy: 809 / 902 (0.8969)

Instance accuracy: 11 / 36 (0.3056)

Holdout group: 5

\*\*\*\*\* Epoch #29 \*\*\*\*\*

Loss: 173.937732

Improvement ratio: -0.006542

Feature L2-norm: 6.438555

Learning rate (eta): 0.001433

Total number of feature updates: 9367

Seconds required for this iteration: 0.452

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (900, 975, 915) (0.9231, 0.9836, 0.9524)

B: (16, 23, 36) (0.6957, 0.4444, 0.5424)

I: (48, 61, 108) (0.7869, 0.4444, 0.5680)

Macro-average precision, recall, F1: (0.801871, 0.624165, 0.687600)  
Item accuracy: 964 / 1059 (0.9103)  
Instance accuracy: 11 / 36 (0.3056)

Holdout group: 6

\*\*\*\*\* Epoch #35 \*\*\*\*\*

Loss: 162.389107

Improvement ratio: -0.022369

Feature L2-norm: 6.594273

Learning rate (eta): 0.001408

Total number of feature updates: 11305

Seconds required for this iteration: 0.657

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (768, 853, 785) (0.9004, 0.9783, 0.9377)

B: (15, 20, 36) (0.7500, 0.4167, 0.5357)

I: (46, 60, 112) (0.7667, 0.4107, 0.5349)

Macro-average precision, recall, F1: (0.805673, 0.601908, 0.669442)

Item accuracy: 829 / 933 (0.8885)

Instance accuracy: 11 / 36 (0.3056)

Holdout group: 7

\*\*\*\*\* Epoch #33 \*\*\*\*\*

Loss: 159.726563

Improvement ratio: -0.027089

Feature L2-norm: 6.604374

Learning rate (eta): 0.001416

Total number of feature updates: 10659

Seconds required for this iteration: 0.860

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (767, 821, 784) (0.9342, 0.9783, 0.9558)

B: (26, 29, 36) (0.8966, 0.7222, 0.8000)

I: (61, 78, 108) (0.7821, 0.5648, 0.6559)

Macro-average precision, recall, F1: (0.870943, 0.755118, 0.803892)

Item accuracy: 854 / 928 (0.9203)

Instance accuracy: 18 / 36 (0.5000)

Holdout group: 8

\*\*\*\*\* Epoch #33 \*\*\*\*\*

Loss: 153.632690

Improvement ratio: -0.010469

Feature L2-norm: 6.519886

Learning rate (eta): 0.001416

Total number of feature updates: 10659

Seconds required for this iteration: 0.531

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (747, 828, 769) (0.9022, 0.9714, 0.9355)

B: (15, 21, 36) (0.7143, 0.4167, 0.5263)

I: (46, 66, 110) (0.6970, 0.4182, 0.5227)

Macro-average precision, recall, F1: (0.771143, 0.602080, 0.661516)

Item accuracy: 808 / 915 (0.8831)

Instance accuracy: 10 / 36 (0.2778)



Holdout group: 9

\*\*\*\*\* Epoch #32 \*\*\*\*\*

Loss: 175.712285

Improvement ratio: -0.055231

Feature L2-norm: 6.520308

Learning rate (eta): 0.001420

Total number of feature updates: 10336

Seconds required for this iteration: 0.808

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (750, 808, 761) (0.9282, 0.9855, 0.9560)

B: (21, 23, 36) (0.9130, 0.5833, 0.7119)

I: (68, 79, 113) (0.8608, 0.6018, 0.7083)

Macro-average precision, recall, F1: (0.900674, 0.723550, 0.792074)

Item accuracy: 839 / 910 (0.9220)

Instance accuracy: 18 / 36 (0.5000)

Holdout group: 10

\*\*\*\*\* Epoch #30 \*\*\*\*\*

Loss: 171.742210

Improvement ratio: -0.019729

Feature L2-norm: 6.449046

Learning rate (eta): 0.001429

Total number of feature updates: 9720

Seconds required for this iteration: 0.639

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (794, 877, 821) (0.9054, 0.9671, 0.9352)

B: (14, 24, 35) (0.5833, 0.4000, 0.4746)

I: (50, 76, 121) (0.6579, 0.4132, 0.5076)

Macro-average precision, recall, F1: (0.715529, 0.593445, 0.639136)

Item accuracy: 858 / 977 (0.8782)

Instance accuracy: 11 / 35 (0.3143)

## ***GPS***

### ***L-BFGS with L1/L2 regularization***

Holdout group: 1

\*\*\*\*\* Iteration #205 \*\*\*\*\*

Loss: 115.429655

Feature norm: 8.546305

Error norm: 0.489915

Active features: 1846694

Line search trials: 1

Line search step: 1.000000

Seconds required for this iteration: 1.222

Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1594, 1705, 1623) (0.9349, 0.9821, 0.9579)  
B: (40, 50, 63) (0.8000, 0.6349, 0.7080)  
I: (104, 125, 194) (0.8320, 0.5361, 0.6520)  
Macro-average precision, recall, F1: (0.855632, 0.717712, 0.772645)  
Item accuracy: 1738 / 1880 (0.9245)  
Instance accuracy: 32 / 63 (0.5079)

Holdout group: 2

\*\*\*\*\* Iteration #215 \*\*\*\*\*

Loss: 115.429655  
Feature norm: 8.546305  
Error norm: 0.489915  
Active features: 1846694  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.222  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1594, 1705, 1623) (0.9349, 0.9821, 0.9579)  
B: (40, 50, 63) (0.8000, 0.6349, 0.7080)  
I: (104, 125, 194) (0.8320, 0.5361, 0.6520)  
Macro-average precision, recall, F1: (0.855632, 0.717712, 0.772645)  
Item accuracy: 1738 / 1880 (0.9245)  
Instance accuracy: 32 / 63 (0.5079)

Holdout group: 3

\*\*\*\*\* Iteration #224 \*\*\*\*\*

Loss: 120.226247  
Feature norm: 8.575585  
Error norm: 0.540260  
Active features: 1886225  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.372  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1202, 1281, 1215) (0.9383, 0.9893, 0.9631)  
B: (41, 46, 63) (0.8913, 0.6508, 0.7523)  
I: (111, 122, 171) (0.9098, 0.6491, 0.7577)  
Macro-average precision, recall, F1: (0.913157, 0.763072, 0.824371)  
Item accuracy: 1354 / 1449 (0.9344)  
Instance accuracy: 38 / 63 (0.6032)

Holdout group: 4

\*\*\*\*\* Iteration #220 \*\*\*\*\*

Loss: 116.520967  
Feature norm: 8.531810  
Error norm: 0.480556  
Active features: 1857624  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.417

Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1429, 1536, 1443) (0.9303, 0.9903, 0.9594)  
B: (39, 42, 63) (0.9286, 0.6190, 0.7429)  
I: (86, 99, 171) (0.8687, 0.5029, 0.6370)  
Macro-average precision, recall, F1: (0.909199, 0.704090, 0.779759)  
Item accuracy: 1554 / 1677 (0.9267)  
Instance accuracy: 30 / 63 (0.4762)

Holdout group: 5

\*\*\*\*\* Iteration #212 \*\*\*\*\*

Loss: 113.829497  
Feature norm: 8.537515  
Error norm: 0.507378  
Active features: 1876876  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.247  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1291, 1444, 1306) (0.8940, 0.9885, 0.9389)  
B: (31, 37, 63) (0.8378, 0.4921, 0.6200)  
I: (77, 88, 200) (0.8750, 0.3850, 0.5347)  
Macro-average precision, recall, F1: (0.868961, 0.621859, 0.697877)  
Item accuracy: 1399 / 1569 (0.8917)  
Instance accuracy: 26 / 63 (0.4127)

Holdout group: 6

\*\*\*\*\* Iteration #209 \*\*\*\*\*

Loss: 113.346588  
Feature norm: 8.524242  
Error norm: 0.546057  
Active features: 1870199  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.589  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1441, 1561, 1455) (0.9231, 0.9904, 0.9556)  
B: (33, 38, 63) (0.8684, 0.5238, 0.6535)  
I: (87, 99, 180) (0.8788, 0.4833, 0.6237)  
Macro-average precision, recall, F1: (0.890112, 0.665840, 0.744231)  
Item accuracy: 1561 / 1698 (0.9193)  
Instance accuracy: 27 / 63 (0.4286)

Holdout group: 7

\*\*\*\*\* Iteration #239 \*\*\*\*\*

Loss: 119.861275  
Feature norm: 8.560310  
Error norm: 0.585614  
Active features: 1887071  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.514

Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1248, 1363, 1262) (0.9156, 0.9889, 0.9509)  
B: (38, 41, 63) (0.9268, 0.6032, 0.7308)  
I: (87, 99, 178) (0.8788, 0.4888, 0.6282)  
Macro-average precision, recall, F1: (0.907081, 0.693615, 0.769928)  
Item accuracy: 1373 / 1503 (0.9135)  
Instance accuracy: 30 / 63 (0.4762)

Holdout group: 8

\*\*\*\*\* Iteration #228 \*\*\*\*\*

Loss: 117.363029  
Feature norm: 8.569084  
Error norm: 0.506768  
Active features: 1891933  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.058  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1175, 1305, 1193) (0.9004, 0.9849, 0.9408)  
B: (35, 41, 63) (0.8537, 0.5556, 0.6731)  
I: (96, 111, 201) (0.8649, 0.4776, 0.6154)  
Macro-average precision, recall, F1: (0.872969, 0.672693, 0.743071)  
Item accuracy: 1306 / 1457 (0.8964)  
Instance accuracy: 33 / 63 (0.5238)

Holdout group: 9

Loss: 114.056984  
Feature norm: 8.556239  
Error norm: 0.428754  
Active features: 1875342  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.119  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1362, 1471, 1403) (0.9259, 0.9708, 0.9478)  
B: (36, 48, 63) (0.7500, 0.5714, 0.6486)  
I: (106, 136, 189) (0.7794, 0.5608, 0.6523)  
Macro-average precision, recall, F1: (0.818438, 0.701017, 0.749588)  
Item accuracy: 1504 / 1655 (0.9088)  
Instance accuracy: 28 / 63 (0.4444)

Holdout group: 10

Loss: 112.372808  
Feature norm: 8.558586  
Error norm: 0.356299  
Active features: 1915285  
Line search trials: 1  
Line search step: 1.000000  
Seconds required for this iteration: 1.405

Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1128, 1214, 1147) (0.9292, 0.9834, 0.9555)  
B: (41, 48, 63) (0.8542, 0.6508, 0.7387)  
I: (99, 114, 166) (0.8684, 0.5964, 0.7071)  
Macro-average precision, recall, F1: (0.883916, 0.743538, 0.800470)  
Item accuracy: 1268 / 1376 (0.9215)  
Instance accuracy: 36 / 63 (0.5714)

### ***SGD with L2-regularization***

Holdout group: 1  
\*\*\*\*\* Epoch #38 \*\*\*\*\*  
Loss: 188.822380  
Improvement ratio: -0.004369  
Feature L2-norm: 7.751698  
Learning rate (eta): 0.001397  
Total number of feature updates: 21546  
Seconds required for this iteration: 1.286  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1587, 1700, 1623) (0.9335, 0.9778, 0.9552)  
B: (40, 52, 63) (0.7692, 0.6349, 0.6957)  
I: (102, 128, 194) (0.7969, 0.5258, 0.6335)  
Macro-average precision, recall, F1: (0.833212, 0.712838, 0.761451)  
Item accuracy: 1729 / 1880 (0.9197)  
Instance accuracy: 29 / 63 (0.4603)

Holdout group: 2  
\*\*\*\*\* Epoch #45 \*\*\*\*\*  
Loss: 204.710611  
Improvement ratio: -0.043242  
Feature L2-norm: 7.972495  
Learning rate (eta): 0.001370  
Total number of feature updates: 25515  
Seconds required for this iteration: 1.295  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1185, 1242, 1215) (0.9541, 0.9753, 0.9646)  
B: (47, 56, 63) (0.8393, 0.7460, 0.7899)  
I: (124, 151, 171) (0.8212, 0.7251, 0.7702)  
Macro-average precision, recall, F1: (0.871528, 0.815496, 0.841564)  
Item accuracy: 1356 / 1449 (0.9358)  
Instance accuracy: 41 / 63 (0.6508)

Holdout group: 3  
\*\*\*\*\* Epoch #31 \*\*\*\*\*  
Loss: 195.275022  
Improvement ratio: -0.000257  
Feature L2-norm: 7.542005  
Learning rate (eta): 0.001425

Total number of feature updates: 17577  
Seconds required for this iteration: 1.114  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1424, 1525, 1443) (0.9338, 0.9868, 0.9596)  
B: (40, 46, 63) (0.8696, 0.6349, 0.7339)  
I: (90, 106, 171) (0.8491, 0.5263, 0.6498)  
Macro-average precision, recall, F1: (0.884131, 0.716023, 0.781111)  
Item accuracy: 1554 / 1677 (0.9267)  
Instance accuracy: 29 / 63 (0.4603)

Holdout group: 4  
\*\*\*\*\* Epoch #39 \*\*\*\*\*  
Loss: 180.954788  
Improvement ratio: -0.000366  
Feature L2-norm: 7.792776  
Learning rate (eta): 0.001393  
Total number of feature updates: 22113  
Seconds required for this iteration: 0.890  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1281, 1411, 1306) (0.9079, 0.9809, 0.9430)  
B: (36, 44, 63) (0.8182, 0.5714, 0.6729)  
I: (91, 114, 200) (0.7982, 0.4550, 0.5796)  
Macro-average precision, recall, F1: (0.841431, 0.669095, 0.731822)  
Item accuracy: 1408 / 1569 (0.8974)  
Instance accuracy: 26 / 63 (0.4127)

Holdout group: 5  
\*\*\*\*\* Epoch #77 \*\*\*\*\*  
Loss: 139.829466  
Improvement ratio: -0.007117  
Feature L2-norm: 7.628442  
Learning rate (eta): 0.000697  
Total number of feature updates: 43659  
Seconds required for this iteration: 1.383  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1365, 1451, 1392) (0.9407, 0.9806, 0.9603)  
B: (40, 51, 63) (0.7843, 0.6349, 0.7018)  
I: (106, 127, 174) (0.8346, 0.6092, 0.7043)  
Macro-average precision, recall, F1: (0.853230, 0.741573, 0.788776)  
Item accuracy: 1511 / 1629 (0.9276)  
Instance accuracy: 33 / 63 (0.5238)

Holdout group: 6  
\*\*\*\*\* Epoch #38 \*\*\*\*\*  
Loss: 186.408629  
Improvement ratio: -0.005748  
Feature L2-norm: 7.769552  
Learning rate (eta): 0.001397  
Total number of feature updates: 21546  
Seconds required for this iteration: 1.682  
Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (1439, 1570, 1455) (0.9166, 0.9890, 0.9514)  
B: (31, 36, 63) (0.8611, 0.4921, 0.6263)  
I: (78, 92, 180) (0.8478, 0.4333, 0.5735)  
Macro-average precision, recall, F1: (0.875166, 0.638133, 0.717066)  
Item accuracy: 1548 / 1698 (0.9117)  
Instance accuracy: 26 / 63 (0.4127)

Holdout group: 7  
\*\*\*\*\* Epoch #38 \*\*\*\*\*  
Loss: 196.471012  
Improvement ratio: -0.094236  
Feature L2-norm: 7.805161  
Learning rate (eta): 0.001397  
Total number of feature updates: 21546  
Seconds required for this iteration: 1.510  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1250, 1353, 1262) (0.9239, 0.9905, 0.9560)  
B: (40, 43, 63) (0.9302, 0.6349, 0.7547)  
I: (95, 107, 178) (0.8879, 0.5337, 0.6667)  
Macro-average precision, recall, F1: (0.913985, 0.719707, 0.792469)  
Item accuracy: 1385 / 1503 (0.9215)  
Instance accuracy: 32 / 63 (0.5079)

Holdout group: 8  
\*\*\*\*\* Epoch #34 \*\*\*\*\*  
Loss: 197.471731  
Improvement ratio: -0.060050  
Feature L2-norm: 7.684714  
Learning rate (eta): 0.001412  
Total number of feature updates: 19278  
Seconds required for this iteration: 1.437  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1175, 1295, 1193) (0.9073, 0.9849, 0.9445)  
B: (37, 43, 63) (0.8605, 0.5873, 0.6981)  
I: (104, 119, 201) (0.8739, 0.5174, 0.6500)  
Macro-average precision, recall, F1: (0.880584, 0.696542, 0.764216)  
Item accuracy: 1316 / 1457 (0.9032)  
Instance accuracy: 35 / 63 (0.5556)

Holdout group: 9  
\*\*\*\*\* Epoch #44 \*\*\*\*\*  
Loss: 155.443668  
Improvement ratio: -0.016611  
Feature L2-norm: 7.850781  
Learning rate (eta): 0.001374  
Total number of feature updates: 24948  
Seconds required for this iteration: 1.707  
Performance by label (#match, #model, #ref) (precision, recall, F1):  
O: (1362, 1473, 1403) (0.9246, 0.9708, 0.9471)

B: (35, 48, 63) (0.7292, 0.5556, 0.6306)  
 I: (104, 134, 189) (0.7761, 0.5503, 0.6440)  
 Macro-average precision, recall, F1: (0.809977, 0.692199, 0.740581)  
 Item accuracy: 1501 / 1655 (0.9069)  
 Instance accuracy: 27 / 63 (0.4286)

Holdout group: 10

\*\*\*\*\* Epoch #93 \*\*\*\*\*

Loss: 132.267344

Improvement ratio: -0.001363

Feature L2-norm: 7.810223

Learning rate (eta): 0.000682

Total number of feature updates: 52731

Seconds required for this iteration: 1.371

Performance by label (#match, #model, #ref) (precision, recall, F1):

O: (1122, 1201, 1147) (0.9342, 0.9782, 0.9557)

B: (44, 53, 63) (0.8302, 0.6984, 0.7586)

I: (103, 122, 166) (0.8443, 0.6205, 0.7153)

Macro-average precision, recall, F1: (0.869557, 0.765700, 0.809868)

Item accuracy: 1269 / 1376 (0.9222)

Instance accuracy: 38 / 63 (0.6032)

### ***(Precision, Recall, F1)***

Algorithm\Product	Earphone	GPS
L-BFGS with L1/L2 regularization	(0.787, 0.519, 0.589)	(0.87, 0.696, 0.76)
SGD with L2-regularization	(0.82, 0.65, 0.714)	(0.86, 0.714, 0.77)