# 8E&F\_LR\_SVM\_Assignment

June 12, 2020

8E: Implementing Decision Function of SVM RBF Kernel

## 0.1 Task E

```
[1]: import numpy as np
     import pandas as pd
     from sklearn.datasets import make_classification
     import numpy as np
     from sklearn.svm import SVC
     import math
[2]: X, y = make_classification(n_samples=5000, n_features=5, n_redundant=2,
                                n_classes=2, weights=[0.7], class_sep=0.7,_
      →random_state=15)
[3]: # train test split
     from sklearn.model_selection import train_test_split
     X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2,_

    stratify=y)
     X_train, X_cv, y_train, y_cv = train_test_split(X_train, y_train, test_size=0.
      →25, stratify=y_train)
[4]: print(X_train.shape,y_train.shape)
     print(X_cv.shape,y_cv.shape)
     print(X_test.shape,y_test.shape)
    (3000, 5) (3000,)
    (1000, 5) (1000,)
    (1000, 5) (1000,)
[5]: clf=SVC(kernel='rbf',gamma=0.001,C=100)
     clf.fit(X_train, y_train)
[5]: SVC(C=100, break_ties=False, cache_size=200, class_weight=None, coef0=0.0,
         decision_function_shape='ovr', degree=3, gamma=0.001, kernel='rbf',
         max_iter=-1, probability=False, random_state=None, shrinking=True,
         tol=0.001, verbose=False)
```

```
[6]: intercept=clf.intercept_
     weights=clf.dual_coef_[0]
     sv=clf.support_vectors_
     params=clf.get_params()
     gamma=params['gamma']
[7]: def kernel(sv,xq,gamma):
         return math.exp(-gamma*np.linalg.norm(sv-xq)**2)
[8]: def decision_function(X_cv,w,intercept,sv,gamma):
         df=[]
         for x in range(len(X cv)):
             summation=0
             for i in range(len(sv)):
                 summation+=(w[i]*kernel(sv[i],X_cv[x],gamma))
             summation+=intercept
             df.extend(summation)
         return df
[9]: fcv=decision_function(X_cv,weights,intercept,sv,gamma)
     print(fcv)
    [-2.74221144072127, -2.5775998188830225, -2.4883995052532906,
    -4.043211136489212, 2.6866764119355726, 1.772425612146741, -2.8230847925626317,
    1.5762789382862725, 0.3955328281657775, 1.6811802269043956, 1.926313187062782,
    -3.2486399068888896, 0.035173053749609995, -2.9914847785231227,
    -2.8976392820258563, -2.517772808522927, -2.6985066354038945,
    -1.8168078195578157, -2.1832510322543963, -2.220917386664062,
    0.7536454747523682, 1.3570474596041113, 0.8464043906359326, 1.364305843454638,
    -2.1057841929463375, 1.5187617698225826, -1.00277011801824,
    -0.07925438794541817, -2.23035489041289, -1.4314144249938248,
    1.6695704074519218, -2.484049943008564, -0.5982174566973764, -4.538152239727673,
    -2.6840494934636108, 1.3112455933702951, -2.2747286586230255,
    0.8362798335487658, 1.176481131308329, -2.4370015872868644, -2.506269772165687,
    1.3349364822850949, -1.9622629941575904, 1.7078860272063214, -2.647615501068294,
    -2.307337868869389, -0.6333887277144679, -2.3076376587169487,
    -1.0008840168915394, -2.581394007853184, -2.4264378065853616,
    -2.857813635070776, 1.4114333688434546, -1.5249612996629973, -3.318000852189861,
    -3.568897138208278, -3.0110936651212152, 1.5973706022994993, -2.451356689724953,
    -1.9353982222190989, -4.074070665796732, -4.542437446388284, 3.1324838631183884,
    0.8043555242258908, 1.5076297909167313, -0.15485251265162203,
    0.5430079287690082, -1.888087619846679, -3.1729111981942633, -3.01844984040256,
    -4.229660153680918, 0.9831907388192396, 1.5122139903092564, -2.2949987883581495,
    -3.5010140919976815, -0.8502130919278765, -1.881821611269309,
```

```
-2.6210109518689744, -3.5493842641004743, -1.9874504071199435,
-1.5654997668547348, 1.6707334423461124, -1.6906413178001496,
-1.540845607385172, -0.46552338001176663, 1.279759322400047,
0.15381704152105913, 0.07740549945969422, -2.5084511724354495,
1.4593036563595452, 1.3981347089779423, -3.0461390155398713, -2.398376549990949,
1.647547461377791, 1.4704993902815535, -2.0206246410460333, -1.3151459090323878,
1.6214972983498446, -3.221028715878283, -2.3173393385392056,
-3.0221786461921947, 1.5582129539051768, 0.5888480160885128, 2.365805546496255,
2.132442275504197, -2.2167579550485565, 1.4637360959327528, -2.572828848097934,
1.3706875519122765, -2.5837663820482173, -3.0739640732493494,
-1.3263882253933938, -2.406575224842292, -3.308229563029975,
-1.9579819624669805, -3.1087093077188466, 0.37392602163154054,
-2.4734335743892824, -1.2460358363687827, -2.7781431254905935,
-0.5504603482873516, -2.0764918899276164, -2.769625997142476,
-1.7106410666833578, -2.514019497825053, -0.46663083201335764,
-2.0657396898944778, -1.7893418758613175, 0.7830558424265139,
-2.240989525486746, -2.1141104600025566, 1.5864042039819783,
-2.0975157174179837, 1.769960151709633, -2.3666495887618235,
0.29606689121981633, -2.9360829693850046, -1.9197884284215756,
-2.5265205011849683, -2.241173209282287, -2.4073971412810873,
-1.221403403723421, -2.6415371379068584, -5.60468510674297, -0.9233750399996619,
1.892131252401676, -3.0376295556396182, -1.8269456647468085, 1.0125664979797695,
-3.0274224545644937, -3.2742520082034967, -3.318188619630497,
-2.2452788574703315, -2.188293656344008, -3.881063564731995,
-3.8408972828338714, -2.8771052194815705, 1.6466217987162755,
0.8593953169111974, -3.052313813350629, 1.700555615972981,
-0.005915616538352264, -1.532101923849488, -2.095855862618158,
-2.1905610551177612, -0.8878584301972761, 1.8840023454140682,
-3.012319392637998, -2.8729950906664707, -1.836990927127935,
-2.3218140769463598, -2.831349124656817, 1.0825018220018383, 1.7480820600557156,
-2.90223988766548, -2.5173697489179356, 1.5883279997026638, -0.5244541373144851,
-0.7319477170270612, 1.9016482693141588, -1.351594244271062, 1.5756086381198107,
0.25589104804093, -2.787757971662493, 0.8406459992244995, 0.006904805543918702,
-2.667583296786368, 0.5706941016978466, 0.8708637703494522, -2.7945755982195446,
1.7268399823287344, -1.9733262380030605, -1.4653886376369836,
0.36490523839322764, 1.3948152953450195, -0.42488538122227437,
-2.0400605319774665, -2.378208933246533, -0.3352464308370382,
-1.500183621434068, 1.8267661147464556, -4.023850047853266, 1.2773334929191056,
-4.0934814462131826, -2.060062519886223, -3.5750965377174064,
-2.3454993251431016, -1.7082375124773743, -2.294379946804703,
-4.088031885717449, -2.03604855917721, 1.8688782187275241, -0.9447686121746623,
-1.2869349936928454, 1.582115088237963, 1.4849882623532484, 0.17883573976148925,
-3.2528109933774156, -2.2252804367487253, 1.6213187783415965,
1.7449781926346266, -2.630567489732392, -4.370948700795289, -1.8632560488671355,
-1.6656724086329784, -3.0313891646098976, -2.102968788803103,
1.8155659761280494, -3.9342026455750196, -3.516496063684293,
-1.4023074709707468, -3.671467859171862, -2.752054027256555, 0.7918191246424944,
-1.7681737443752534, -1.7900819197072688, -1.3006717115760504,
```

```
1.3265183714027917, -3.0073999004293834, 3.0664455811442726,
-1.1274601579104977, -1.8308651442997141, -2.550119801964534,
-3.224354378144717, -2.0234120306722114, -2.6517242865286543,
1.0699113491857664, -3.805630441652631, -1.4253037389572039,
-2.2073290999858766, -2.9038519122503668, -1.4256654729356835,
1.3449331493454015, -3.6636417268265613, 1.3547470514389706, -2.671951118514279,
2.4038857913351497, -1.6348260500393432, 1.2054175029301963,
-3.2587370612795534, -5.407451294477447, 0.37065467566159116, 2.336246212597111,
-3.1963929892853638, -3.4062393710116576, 1.6613386920395574,
-3.1370412978097657, -4.1253561464844, 0.5862077598070035, -1.8614836541818316,
-2.814964287562652, 1.696136593723502, -3.010606270470596, -1.9104700620515085,
-0.8914371940067052, -1.99340029233587, -2.1042187806281656,
-2.2796936702779713, -2.8081824038730683, -2.415399130187502,
-1.1146130098613223, -2.688001243003988, -2.924639411624859, 0.5535232268563068,
-1.0049162268588883, 0.4637873359268032, 0.20609909359351564,
-3.091484003408176, -2.934707898582651, -2.2863651849956095,
-3.2419795370814124, -0.5215667440410026, -2.095469797338772,
2.4221403792701683, -1.0045916354406539, 0.8471850679337583,
-0.5321364066245802, -2.6996137946754213, -3.7886587300157326,
-3.3424928391478725, -1.7388988331141557, -2.673605420897949,
-1.0443586307216814, -2.6667987787024354, -3.2401401454030245,
-1.35612363845653, -2.187322146743845, 1.6850348346835138, 2.4187116641314153,
-2.766952475675829, 0.09556397600078315, -3.1258857791261287,
-0.4390000175862876, -3.9001266770822762, -3.1374579546337666,
-3.1185764551582262, -2.170323616112618, 1.385258078483297, -2.3992742853296316,
-2.924129896082469, 0.8675838466443726, -3.021745073831219, -2.833009855970921,
0.4896546779708264, -2.96720873829674, 1.9933275112807611, 0.020357567615655103,
-2.602900597488478, -3.2091467101980764, -2.6250018994120334,
-3.8357280018442803, -1.679316653947232, -0.48455431031403107,
-3.258635342173839, -3.3309852295211395, -2.3704694695295028, 2.452812910462733,
-3.4798579610023164, -3.1281077960749495, -4.800968413109636, 2.172673021543368,
-2.837859060339887, -1.4001853480081716, 1.3608263196896577,
-1.4470006256004875, 1.1233475615942514, -0.6197106058638222,
-0.1715855144890308, -1.5931577483242658, 1.9644790406404629,
-2.557058174523355, -0.6561045698364931, 0.20368075527115836,
-2.221945510380301, -4.254604946236363, -2.8334537811601517,
-1.3228182744482164, -2.961992261495588, -2.443299325527398,
-0.4782933719957394,\ 2.314502556490375,\ -2.6441444688605666,\ 1.1081687223702734,
1.6630110333553962, -2.087910268954054, -3.8647806901603228, -2.582964730384553,
-3.6055348921457617, -2.0443210301650434, -2.278755571800637,
1.7656157560904338, -2.118596988214342, 1.1989580957160304, -1.8244314536812207,
-3.1477313341730233, -4.0397609656413564, 0.7673575109382473,
-3.001469160639537, -2.5651488811815066, -2.892673618927169,
-0.7720510739115478, 0.6894502329390311, -1.3730467594813898,
-1.207210398405088, -2.9687657843312176, -3.120281113667694, -2.673122692530462,
1.006643239686135, -1.2322660887335881, -1.0775289458923036,
-3.1392119710063677, -1.6949091024736656, -1.6337102968423305,
-3.2550176390319403, 1.5100964732712119, -1.9795567593855092,
```

```
-2.562373244987064, -3.7597287142313927, 1.836265201015984, -1.6715953791782634,
1.7209291032698748, -2.785032792774906, -4.173938114802716, -2.108054169392879,
-1.7906002312738631, -2.581503526707443, -0.0029249682328820192,
-0.24414167590931113, 3.8361467493419714, -2.721017866129578,
-1.946971775166538, -0.23102206055967356, -2.6031709877620623,
-2.4686642898471756, -0.2605653839155688, 1.8367462464225572,
-2.6380578572123805, -3.0455750094022345, 1.734591982540771,
-0.9064968657320018, -3.4605139874779165, 1.2589967893961576,
-0.6226861683343041, -3.485191662272761, -2.4751382429614703,
-1.5807421558546717, -2.8039641316774957, -0.8633872973891736,
-1.4889602791735466, -3.364803899952484, 0.49489745787699535,
-2.525107561439149, -3.042495795767557, -3.74524908831993, -1.8744978023573462,
-3.043836466893658, -2.4209295373944637, -3.6265031760664566, 1.860483025332052,
2.1679245088112045, -2.644541296199072, -4.645718925951606, -2.684883471870314,
-1.9709070981803118, 0.2845800291886822, 2.6378102903220157,
-0.6906361205741756, -3.5600521232617335, 1.9613447720564285,
-0.8041977381533125, -2.8940489953959267, -3.1617500741836504,
-3.711763808726452, -1.6130161107181702, -3.970010975653444,
-0.7716117867576808, -2.8500202466896876, -0.9800035870781794,
-2.887764140221442, -0.2262645609826346, -2.00734403607624, -2.125062540456177,
-3.1589801436159273, -0.12534320282896472, 1.4852955419651797,
-1.8158986531709256, -3.5257029214333993, -0.5117229071343341,
0.5911477999030486, -4.63402325472628, -3.653029186032874, 1.9963537766991881,
0.6319897224512734, -2.448451923275321, -2.612414948074622, 1.9515444107927142,
-2.923072715483904, 2.071020350877554, -2.517574321214276, -2.3145469568830417,
-2.6012355695554628, 1.4895091036948078, -1.546234930035531,
-1.2820251218458547, 0.5457746011258213, -0.3749565275755695,
1.0360589754858371, 1.8486153192733998, -3.383732015184797, 1.0710146897356698,
-1.590740268262571, -0.5254831473934085, -2.9543212322243515,
-3.080026377559441, -3.694045427446049, 0.8059266028298784, -3.2259914280943955,
-0.3248082038924376, -3.520154288363933, -0.6827574976395634,
-1.9422466490699644, -2.6173482895790054, -3.3594633874970365,
1.8421578675968466, -0.25229459475942617, -3.279256197727086,
-4.3288144285347485, -3.3486966911968703, -3.1489640033194273,
-3.6100261269040668, -3.8150838792712203, -2.735852928684174,
-2.249532931524946, -1.572148024674895, -0.9440192506567437,
-1.4117270836640965, -4.515453479490311, 1.2835270970495647,
-0.08090204992156869, -3.4044984562752556, -4.093838928720864,
1.5990020740953885, -0.26914946870638046, -1.8602682468105551,
-0.9926112896447488, -1.7959812712590728, -3.5526418364179544,
-4.142865930575816, -2.5741329604759566, -2.1997271057557906,
-3.1613915607477945, -2.2443758059280934, 1.6087008385067993,
-2.729484417278847, -1.9261125056326516, 1.0426815341031035, -3.532265208941545,
1.6723335152426064, 1.8237350820893927, -2.7493592145409944, -4.078391055299967,
-0.5533220376438446, -2.7203431234878717, 1.8412021038689734,
-2.257561423793795, -1.5575335540411355, -2.5169606110854015, 2.935413872858199,
2.160375592568166, -2.8927726098453017, -3.5520962670708722, -3.873584928179191,
1.5169589815688842, -4.118428937091686, 2.3225433836879223, -3.3046524151144676,
```

```
-1.4802124342608702, -2.5125721861391024, 1.8454291740094182,
-0.9916185358249474, 1.0954175279188054, -3.2992696173323064,
2.9294449631709303, -4.049853211654671, 1.8462927315121154, 2.006906792651002,
-2.745394184285622, -2.2781159765031798, -2.011072320782979,
-2.7556026476189497, 1.8758062301201694, -2.5477912087533023,
2.2706016420512687, -3.188607405839782, -3.3483853520162152, 1.6662259292804795,
-1.557051157664311, 3.8350458816634547, -3.1981208385076125,
-0.6342019820285496, -2.9856319902906487, 0.5325773158329885,
0.045226929408493266, -3.3154025565491945, -2.108959678506188,
-3.896506537366427, -2.696834166424615, -3.127754717566965, -2.231201294150544,
-0.966820753301, 0.9102815810261622, -0.6068210456897627, -1.6896690731458146,
1.1510485179607817, 1.8470577185323198, -2.9697380001763842, 1.3307301086549548,
-2.600326475948257, -2.8244767592701616, -2.700884492813365,
-3.0780048766804735, 1.7954614007815697, 2.196023175672828, 1.6675053300271476,
1.1626174891366579, -1.9925672896805433, -2.4319213956806247,
-1.950715571049137, -2.7140804831929084, -2.5225750017291158,
-2.404967047396475, 1.6001424898808598, -0.1142612014033868,
-1.2783087202265686, -1.752932320047257, -0.19680087273876934,
-2.0277760567744347, 0.7543421468898335, -2.6443920334692375,
0.4412728952268954, 1.664205128223522, -2.4719695113083797,
-0.12018289625299117, -1.50178756925667, -1.0652875896103704,
-2.3696395819218377, -2.189581677954656, -1.8270926758533004,
-3.0155704873965514, -0.48481521266261707, 0.9010434523534561,
-3.3661751610876887, 1.1036797502119744, -1.1916267900966555,
-2.7957185243120004, 0.2251521354953856, -3.0738254816751645, -2.65804394698123,
-1.8231399450183043, 1.8788184130279082, -1.4959294200385993, 0.731834512955182,
-2.431715813537259, -2.5047079784572257, -0.20474826445010974,
-1.6569472185948437, -0.6772672997430713, -2.739328246844529,
-1.9651873878189927, 2.291504820518917, -2.0928003372697144,
0.48296309894347944, 1.2464854091878057, -2.7760240822363538,
-0.5007252352895288, -0.21939621138414322, -3.2314350039410935,\\
-3.181789717091625, 1.5612435294365885, -3.0338816285135475, -3.687469652273101,
1.4589992814973916, 1.6000221147978455, 1.6856121712771217, -2.3428611999452253,
-2.39212495364746, -3.294643253483421, 1.5430113004879549, 1.5018172701639192,
-0.27175090624378795, 1.8160478276380378, -1.782205925065362, 2.038407813164675,
-3.784139463289058, -2.920882761631453, -3.274705878296181, -3.555070758757672,
-3.9247594509695385, 1.646450514474275, 1.6786905243096943, -3.9348966139101473,
-2.8178449691552667, -0.3688077194696784, -2.232505268801354,
-3.1714512668273964, -3.068485759697928, 1.865541198717246, -3.451721740269512,
-1.6982894087631517, -4.020536598140218, -1.5521684576074288,
-2.0233141145776226, -2.105718894384402, -3.55905805317068, -2.4989824322942904,
-2.281727688371269, 2.744902488917852, -2.833632127447593, 2.2434467988394506,
-3.3470166862669752, -0.8731175087172498, -3.232031642912595,
-1.129690370151287, -0.766710923816738, -2.4215389501456808, -3.038951399828029,
-2.919879424204502, 1.3849475584183684, -3.3942196765714168, -3.694929812945666,
3.0348548794772445, -3.953807325385973, 1.2385863564276396, -3.6215565659643754,
-1.436962924760301, -1.353017862138493, -1.7696425451295918,
-2.1127524587344264, 0.27010320806237376, -2.269123954215537,
```

```
-3.7985660093667444, 0.5860065650143231, -2.091850507573987, -2.5612918205307618, -1.6917045380572726, -1.6102396923257127,
```

- -3.569712591083778, -2.6128993743700515, -2.755779975940022,
- -3.2818440642277618, 1.8720951907441976, -3.743777562470164, -3.12619554680986,
- -1.2754477138748181, 1.3398994364917134, 2.3228339179044544,
- -3.1310900594516293, -1.9653725189710864, -3.053319549289007,
- -2.437935403554554, -2.5512223366277946, -0.4133102678379639,
- -2.8502078546949075, -1.7215133436711407, -1.6090239770742651,
- -0.3468626440256837, -0.9805524524130855, -3.6344823824098493,
- -1.1330621570852126, -4.122414734016935, -1.532193635980327, 1.564217967167075,
- -2.081725206715084, -1.3487920964667874, -3.0722432277018963, -4.07542645453065,
- -0.03864880798504755, -3.608204332782598, -3.5779952879311376,
- -2.732140189710115, -3.6161025571626406, 2.1518359343374063, 1.748097021307466,
- -1.8265076211962916, -1.9912461138610733, -2.6318055814282313,
- 1.0416048122997883, -2.0223476230076964, -0.8158079399854397,
- 0.6428939505343796, -0.3734103751263187, 2.1143083889936567, -2.44344631757405,
- 2.0902595474013386, -1.5264858815992919, 2.4393744180626347, 2.0331074593772844,
- -1.3651927345057753, -0.6049208495384941, -2.296167473803656,
- -2.591266627859404, -3.054977502411155, -1.740285734225942, -0.3125934532938497,
- 2.4388093595087317, -2.4534217756813415, 0.25214697457757795,
- 1.3959266496345397, 1.808904925961294, -0.35350809089906177, 1.1950296025414322,
- 1.0850441960512929, 1.5009693752524034, 1.4439349678185143, 0.04625868972406311,
- -3.5847577294009265, -3.240212838012304, -1.9655342110049001,
- 1.3723732956825008, -0.8562307068486272, -1.7913370022589343,
- 0.6369654861472971, 1.3961091613127867, 1.3955617096554893, 0.5078264109212758,
- -3.040671352006789, 1.502028484824216, -2.03975514439967, 0.12060921389986179,
- -0.8399258566046153, -0.21344808140677385, -2.7138519343298166,
- 1.8893991222385371, -3.160845760285532, -1.3775933838886298, -3.793946577948382,
- -0.3026643129117512, -1.3653223768762568, -0.08916215108555248,
- -2.171392543757214, -1.5157382527828456, -2.0144806021873545,
- -1.785147430785052, -3.1976519640706793, -2.681515523926229, 0.7522626924060707,
- -3.9762592036416673, -2.616529068941382, 1.5968868507537697,
- -1.8795611264195098, -4.068373184541208, -3.257685223561388, -2.188678627318232,
- -2.800727883260485, -2.3763348351158196, -4.045142350594382,
- -3.7435796106710124, -2.9584741714505536, 0.6620688092827227, 1.475968356250228,
- -3.0403718022855126, 1.314367076831552, -1.793956123614684, -0.8841020413893044,
- -2.0459620127906883, 0.18180747166655253, 0.9839323814817296, 1.642093306988905,
- 0.7582899812854511, 0.8696210572676013, 1.8182838811306472,
- 0.041332327723829554, -0.8209900424767151, -2.507689553726983, -1.7136130520717,
- -0.5338101680133671, -1.261266506481284, -3.782329106776309,
- -1.6604453572402842, 0.9188450838255382, -1.181133615802103, -1.07427110483605,
- -3.163350918438844, -1.8151019158964838, 1.897974658087755,
- 5.8508106839827434e-05, -1.9538263007013437, -1.6639039820393218,
- -1.0403073551173843, -3.2061479844802885, 0.1777468332936185,
- -3.457020012097693, -3.348346231049596, -4.644230688293284, -2.6632274410846644,
- -4.578452939519288, -3.4400910138977063, -1.5032015012888489, -2.49085764964915,
- -2.0169872540212377, 1.9418831058902204, -3.8121802471785524,
- -4.0253253514630885, -1.7081113828977617, 1.6413631867553922,

```
-0.36672195355099957, -3.190105671427879, -2.5303130471600705,
     -2.3753135566786834, -2.276122655617207, 1.2713008847536078,
     -1.1568971904105676, -2.39209640106889, -3.5368351637039193,
     -2.1036587977342047, -2.696988116311594, -3.3901796958188224,
     -1.6661577734631758, -0.15757963127202101, 1.3636359918262788,
     -3.875882566845284, 3.1262526717795613, 0.63569150765256, -0.18193297857373336,
     -2.2679595209392924, -3.8068620109224507, 1.1466615861208216,
     -1.9519073305364638, 2.131972943416621, -1.4060328465450236,
     -1.7009711296374301, 1.986067333462508, -3.272617539633081, -2.7293916556063844,
     -1.2508441153092558, 1.2860250370033488, -2.704953406955006,
     -0.8207170963838233, -2.283937552298688, 1.588881943016141, -3.0629514714715564,
     -2.532510188607325, 1.7745341306338607, -3.582630193362298, -2.0417033480157936,
     -1.303336132426686, -0.7125835155588258, -3.5633773111378626,
     -3.877658789420074, 0.777261767192464, 1.568242906339997, 1.22433273241213,
     -2.0863620364384086, -2.974808104647557, -2.6499765824254164,
     -2.8159427732829623, -1.896013849351497, -3.192953588651441, 1.6233608911835877,
     1.5166395979432754, -2.255767459686289, 0.9185321251319256, -0.9485224055821457,
     -2.9529940241345467, -0.7642390619600898, -0.31456645129906446,
     -2.9725265858340815, -1.5461323092596255, 0.3478151758775785,
     2.3577609594227273, -2.530865458549179, -3.8865646782649814,
     -2.3561712570133646, 1.72298735960532, -2.4850971996996587, 1.2456901241831493,
     -2.457823460916891, 1.7478749956356627, 1.7451947281835989, 1.6706252354397937,
     1.8042851659978614, -2.738920320863293, -2.94593997621407, 1.713016845628339,
     3.1476044379820896, 1.3755522444380905, -4.168604901965132, -2.672873852348793,
     1.3656497276095156, 1.717327515555731, 2.1809042208539258, -2.286981673635331,
     -2.3331960283823387, -2.799458384397347, -4.175566246985774,
     -2.1660226639597293, 0.047845032378994734, 1.8315441812849618,
     -0.15612168093058854, 1.2486911150940405, -3.325214158097999,
     -2.856345748540242, -3.0586875876803314, 1.441890361889627, -2.1792452898043915,
     -2.6802112153755426, -2.8287644273390877, -2.817406228337368,
     1.1835692966063438, \ -1.7383236832188156, \ 1.7598100713113998, \ -2.210875421215611,
     1.3646543686300068, 2.4096847631638743, 0.7470279238381399, -2.311215483415601]
[10]: clf.decision function(X cv)
[10]: array([-2.74221144e+00, -2.57759982e+00, -2.48839951e+00, -4.04321114e+00,
             2.68667641e+00, 1.77242561e+00, -2.82308479e+00, 1.57627894e+00,
             3.95532828e-01, 1.68118023e+00, 1.92631319e+00, -3.24863991e+00,
             3.51730537e-02, -2.99148478e+00, -2.89763928e+00, -2.51777281e+00,
             -2.69850664e+00, -1.81680782e+00, -2.18325103e+00, -2.22091739e+00,
             7.53645475e-01, 1.35704746e+00, 8.46404391e-01, 1.36430584e+00,
             -2.10578419e+00, 1.51876177e+00, -1.00277012e+00, -7.92543879e-02,
             -2.23035489e+00, -1.43141442e+00, 1.66957041e+00, -2.48404994e+00,
             -5.98217457e-01, -4.53815224e+00, -2.68404949e+00, 1.31124559e+00,
             -2.27472866e+00, 8.36279834e-01, 1.17648113e+00, -2.43700159e+00,
             -2.50626977e+00, 1.33493648e+00, -1.96226299e+00, 1.70788603e+00,
```

0.7993256258785455, 2.050165545306705, -3.382019401318636, -1.5387546100494585,

```
-2.64761550e+00, -2.30733787e+00, -6.33388728e-01, -2.30763766e+00,
-1.00088402e+00, -2.58139401e+00, -2.42643781e+00, -2.85781364e+00,
1.41143337e+00, -1.52496130e+00, -3.31800085e+00, -3.56889714e+00,
-3.01109367e+00, 1.59737060e+00, -2.45135669e+00, -1.93539822e+00,
-4.07407067e+00, -4.54243745e+00, 3.13248386e+00, 8.04355524e-01,
1.50762979e+00, -1.54852513e-01, 5.43007929e-01, -1.88808762e+00,
-3.17291120e+00, -3.01844984e+00, -4.22966015e+00, 9.83190739e-01,
1.51221399e+00, -2.29499879e+00, -3.50101409e+00, -8.50213092e-01,
-1.88182161e+00, -2.62101095e+00, -3.54938426e+00, -1.98745041e+00,
-1.56549977e+00, 1.67073344e+00, -1.69064132e+00, -1.54084561e+00,
-4.65523380e-01, 1.27975932e+00, 1.53817042e-01, 7.74054995e-02,
-2.50845117e+00, 1.45930366e+00, 1.39813471e+00, -3.04613902e+00,
-2.39837655e+00, 1.64754746e+00, 1.47049939e+00, -2.02062464e+00,
-1.31514591e+00, 1.62149730e+00, -3.22102872e+00, -2.31733934e+00,
-3.02217865e+00, 1.55821295e+00, 5.88848016e-01, 2.36580555e+00,
2.13244228e+00, -2.21675796e+00, 1.46373610e+00, -2.57282885e+00,
1.37068755e+00, -2.58376638e+00, -3.07396407e+00, -1.32638823e+00,
-2.40657522e+00, -3.30822956e+00, -1.95798196e+00, -3.10870931e+00,
3.73926022e-01, -2.47343357e+00, -1.24603584e+00, -2.77814313e+00,
-5.50460348e-01, -2.07649189e+00, -2.76962600e+00, -1.71064107e+00,
-2.51401950e+00, -4.66630832e-01, -2.06573969e+00, -1.78934188e+00,
7.83055842e-01, -2.24098953e+00, -2.11411046e+00, 1.58640420e+00,
-2.09751572e+00, 1.76996015e+00, -2.36664959e+00, 2.96066891e-01,
-2.93608297e+00, -1.91978843e+00, -2.52652050e+00, -2.24117321e+00,
-2.40739714 e + 00, -1.22140340 e + 00, -2.64153714 e + 00, -5.60468511 e + 00, \\
-9.23375040e-01, 1.89213125e+00, -3.03762956e+00, -1.82694566e+00,
1.01256650e + 00, -3.02742245e + 00, -3.27425201e + 00, -3.31818862e + 00,\\
-2.24527886e+00, -2.18829366e+00, -3.88106356e+00, -3.84089728e+00,
-2.87710522e+00, 1.64662180e+00, 8.59395317e-01, -3.05231381e+00,
1.70055562e+00, -5.91561654e-03, -1.53210192e+00, -2.09585586e+00,
-2.19056106e+00, -8.87858430e-01, 1.88400235e+00, -3.01231939e+00,
-2.87299509e+00, -1.83699093e+00, -2.32181408e+00, -2.83134912e+00,
1.08250182e+00, 1.74808206e+00, -2.90223989e+00, -2.51736975e+00,
1.58832800e+00, -5.24454137e-01, -7.31947717e-01, 1.90164827e+00,
-1.35159424e+00, 1.57560864e+00, 2.55891048e-01, -2.78775797e+00,
8.40645999e-01, 6.90480554e-03, -2.66758330e+00, 5.70694102e-01,
8.70863770e-01, -2.79457560e+00, 1.72683998e+00, -1.97332624e+00,
-1.46538864e+00, 3.64905238e-01, 1.39481530e+00, -4.24885381e-01,
-2.04006053e+00, -2.37820893e+00, -3.35246431e-01, -1.50018362e+00,
1.82676611e+00, -4.02385005e+00, 1.27733349e+00, -4.09348145e+00,
-2.06006252e+00, -3.57509654e+00, -2.34549933e+00, -1.70823751e+00,
-2.29437995e+00, -4.08803189e+00, -2.03604856e+00, 1.86887822e+00,
-9.44768612e-01, -1.28693499e+00, 1.58211509e+00, 1.48498826e+00,
1.78835740e-01, -3.25281099e+00, -2.22528044e+00, 1.62131878e+00,
1.74497819e+00, -2.63056749e+00, -4.37094870e+00, -1.86325605e+00,
-1.66567241e+00, -3.03138916e+00, -2.10296879e+00, 1.81556598e+00,
-3.93420265e+00, -3.51649606e+00, -1.40230747e+00, -3.67146786e+00,
```

```
-2.75205403e+00, 7.91819125e-01, -1.76817374e+00, -1.79008192e+00,
-1.30067171e+00, 1.32651837e+00, -3.00739990e+00, 3.06644558e+00,
-1.12746016e+00, -1.83086514e+00, -2.55011980e+00, -3.22435438e+00,
-2.02341203e+00, -2.65172429e+00, 1.06991135e+00, -3.80563044e+00,
-1.42530374e+00, -2.20732910e+00, -2.90385191e+00, -1.42566547e+00,
1.34493315e+00, -3.66364173e+00, 1.35474705e+00, -2.67195112e+00,
2.40388579e+00, -1.63482605e+00, 1.20541750e+00, -3.25873706e+00,
-5.40745129e+00, 3.70654676e-01, 2.33624621e+00, -3.19639299e+00,
-3.40623937e+00, 1.66133869e+00, -3.13704130e+00, -4.12535615e+00,
5.86207760e-01, -1.86148365e+00, -2.81496429e+00, 1.69613659e+00,
-3.01060627e+00, -1.91047006e+00, -8.91437194e-01, -1.99340029e+00,
-2.10421878e+00, -2.27969367e+00, -2.80818240e+00, -2.41539913e+00,
-1.11461301e+00, -2.68800124e+00, -2.92463941e+00, 5.53523227e-01,
-1.00491623e+00, 4.63787336e-01, 2.06099094e-01, -3.09148400e+00,
-2.93470790e+00, -2.28636518e+00, -3.24197954e+00, -5.21566744e-01,
-2.09546980e+00, 2.42214038e+00, -1.00459164e+00, 8.47185068e-01,
-5.32136407e-01, -2.69961379e+00, -3.78865873e+00, -3.34249284e+00,
-1.73889883e+00, -2.67360542e+00, -1.04435863e+00, -2.66679878e+00,
-3.24014015e+00, -1.35612364e+00, -2.18732215e+00, 1.68503483e+00,
2.41871166e+00, -2.76695248e+00, 9.55639760e-02, -3.12588578e+00,
-4.39000018e-01, -3.90012668e+00, -3.13745795e+00, -3.11857646e+00,
-2.17032362e+00, 1.38525808e+00, -2.39927429e+00, -2.92412990e+00,
8.67583847e-01, -3.02174507e+00, -2.83300986e+00, 4.89654678e-01,
-2.96720874e+00, 1.99332751e+00, 2.03575676e-02, -2.60290060e+00,
-3.20914671e+00, -2.62500190e+00, -3.83572800e+00, -1.67931665e+00,
-4.84554310e-01, -3.25863534e+00, -3.33098523e+00, -2.37046947e+00,
2.45281291e+00, -3.47985796e+00, -3.12810780e+00, -4.80096841e+00,
2.17267302e+00, -2.83785906e+00, -1.40018535e+00, 1.36082632e+00,
-1.44700063e+00, 1.12334756e+00, -6.19710606e-01, -1.71585514e-01,
-1.59315775e+00, 1.96447904e+00, -2.55705817e+00, -6.56104570e-01,
2.03680755e-01, -2.22194551e+00, -4.25460495e+00, -2.83345378e+00,
-1.32281827e+00, -2.96199226e+00, -2.44329933e+00, -4.78293372e-01,
2.31450256e+00, -2.64414447e+00, 1.10816872e+00, 1.66301103e+00,
-2.08791027e+00, -3.86478069e+00, -2.58296473e+00, -3.60553489e+00,
-2.04432103e+00, -2.27875557e+00, 1.76561576e+00, -2.11859699e+00,
1.19895810e+00, -1.82443145e+00, -3.14773133e+00, -4.03976097e+00,
7.67357511e-01, -3.00146916e+00, -2.56514888e+00, -2.89267362e+00,
-7.72051074e-01, 6.89450233e-01, -1.37304676e+00, -1.20721040e+00,
-2.96876578e+00, -3.12028111e+00, -2.67312269e+00, 1.00664324e+00,
-1.23226609e+00, -1.07752895e+00, -3.13921197e+00, -1.69490910e+00,
-1.63371030e+00, -3.25501764e+00, 1.51009647e+00, -1.97955676e+00,
-2.56237324e+00, -3.75972871e+00, 1.83626520e+00, -1.67159538e+00,
1.72092910e+00, -2.78503279e+00, -4.17393811e+00, -2.10805417e+00,
-1.79060023e+00, -2.58150353e+00, -2.92496823e-03, -2.44141676e-01,
3.83614675e+00, -2.72101787e+00, -1.94697178e+00, -2.31022061e-01,
-2.60317099e+00, -2.46866429e+00, -2.60565384e-01, 1.83674625e+00,
-2.63805786e+00, -3.04557501e+00, 1.73459198e+00, -9.06496866e-01,
```

```
-3.46051399e+00, 1.25899679e+00, -6.22686168e-01, -3.48519166e+00,
-2.47513824e+00, -1.58074216e+00, -2.80396413e+00, -8.63387297e-01,
-1.48896028e+00, -3.36480390e+00, 4.94897458e-01, -2.52510756e+00,
-3.04249580e+00, -3.74524909e+00, -1.87449780e+00, -3.04383647e+00,
-2.42092954e+00, -3.62650318e+00, 1.86048303e+00, 2.16792451e+00,
-2.64454130e+00, -4.64571893e+00, -2.68488347e+00, -1.97090710e+00,
2.84580029e-01, 2.63781029e+00, -6.90636121e-01, -3.56005212e+00,
1.96134477e+00, -8.04197738e-01, -2.89404900e+00, -3.16175007e+00,
-3.71176381e+00, -1.61301611e+00, -3.97001098e+00, -7.71611787e-01,
-2.85002025e+00, -9.80003587e-01, -2.88776414e+00, -2.26264561e-01,
-2.00734404e+00, -2.12506254e+00, -3.15898014e+00, -1.25343203e-01,
1.48529554e+00, -1.81589865e+00, -3.52570292e+00, -5.11722907e-01,
5.91147800e-01, -4.63402325e+00, -3.65302919e+00, 1.99635378e+00,
6.31989722e-01, -2.44845192e+00, -2.61241495e+00, 1.95154441e+00,
-2.92307272e+00, 2.07102035e+00, -2.51757432e+00, -2.31454696e+00,
-2.60123557e+00, 1.48950910e+00, -1.54623493e+00, -1.28202512e+00,
5.45774601e-01, -3.74956528e-01, 1.03605898e+00, 1.84861532e+00,
-3.38373202e+00, 1.07101469e+00, -1.59074027e+00, -5.25483147e-01,
-2.95432123e+00, -3.08002638e+00, -3.69404543e+00, 8.05926603e-01,
-3.22599143e+00, -3.24808204e-01, -3.52015429e+00, -6.82757498e-01,
-1.94224665e+00, -2.61734829e+00, -3.35946339e+00, 1.84215787e+00,
-2.52294595e-01, -3.27925620e+00, -4.32881443e+00, -3.34869669e+00,
-3.14896400e+00, -3.61002613e+00, -3.81508388e+00, -2.73585293e+00,
-2.24953293e+00, -1.57214802e+00, -9.44019251e-01, -1.41172708e+00,
-4.51545348e+00, 1.28352710e+00, -8.09020499e-02, -3.40449846e+00,
-4.09383893e+00, 1.59900207e+00, -2.69149469e-01, -1.86026825e+00,
-9.92611290e-01, -1.79598127e+00, -3.55264184e+00, -4.14286593e+00,
-2.57413296e+00, -2.19972711e+00, -3.16139156e+00, -2.24437581e+00,
1.60870084e+00, -2.72948442e+00, -1.92611251e+00, 1.04268153e+00,
-3.53226521e+00, 1.67233352e+00, 1.82373508e+00, -2.74935921e+00,
-4.07839106e+00, -5.53322038e-01, -2.72034312e+00, 1.84120210e+00,
-2.25756142e+00, -1.55753355e+00, -2.51696061e+00, 2.93541387e+00,
2.16037559e+00, -2.89277261e+00, -3.55209627e+00, -3.87358493e+00,
1.51695898e+00, -4.11842894e+00, 2.32254338e+00, -3.30465242e+00,
-1.48021243e+00, -2.51257219e+00, 1.84542917e+00, -9.91618536e-01,
1.09541753e+00, -3.29926962e+00, 2.92944496e+00, -4.04985321e+00,
1.84629273e+00, 2.00690679e+00, -2.74539418e+00, -2.27811598e+00,
-2.01107232e+00, -2.75560265e+00, 1.87580623e+00, -2.54779121e+00,
2.27060164e+00, -3.18860741e+00, -3.34838535e+00, 1.66622593e+00,
-1.55705116e+00, 3.83504588e+00, -3.19812084e+00, -6.34201982e-01,
-2.98563199e+00, 5.32577316e-01, 4.52269294e-02, -3.31540256e+00,
-2.10895968e+00, -3.89650654e+00, -2.69683417e+00, -3.12775472e+00,
-2.23120129e+00, -9.66820753e-01, 9.10281581e-01, -6.06821046e-01,
-1.68966907e+00, 1.15104852e+00, 1.84705772e+00, -2.96973800e+00,
1.33073011e+00, -2.60032648e+00, -2.82447676e+00, -2.70088449e+00,
-3.07800488e+00, 1.79546140e+00, 2.19602318e+00, 1.66750533e+00,
1.16261749e+00, -1.99256729e+00, -2.43192140e+00, -1.95071557e+00,
```

```
-2.71408048e+00, -2.52257500e+00, -2.40496705e+00, 1.60014249e+00,
-1.14261201e-01, -1.27830872e+00, -1.75293232e+00, -1.96800873e-01,
-2.02777606e+00, 7.54342147e-01, -2.64439203e+00, 4.41272895e-01,
1.66420513e+00, -2.47196951e+00, -1.20182896e-01, -1.50178757e+00,
-1.06528759e+00, -2.36963958e+00, -2.18958168e+00, -1.82709268e+00,
-3.01557049e+00, -4.84815213e-01, 9.01043452e-01, -3.36617516e+00,
1.10367975e+00, -1.19162679e+00, -2.79571852e+00, 2.25152135e-01,
-3.07382548e+00, -2.65804395e+00, -1.82313995e+00, 1.87881841e+00,
-1.49592942e+00, 7.31834513e-01, -2.43171581e+00, -2.50470798e+00,
-2.04748264e-01, -1.65694722e+00, -6.77267300e-01, -2.73932825e+00,
-1.96518739e+00, 2.29150482e+00, -2.09280034e+00, 4.82963099e-01,
1.24648541e+00, -2.77602408e+00, -5.00725235e-01, -2.19396211e-01,
-3.23143500e+00, -3.18178972e+00, 1.56124353e+00, -3.03388163e+00,
-3.68746965e+00, 1.45899928e+00, 1.60002211e+00, 1.68561217e+00,
-2.34286120e+00, -2.39212495e+00, -3.29464325e+00, 1.54301130e+00,
1.50181727e+00, -2.71750906e-01, 1.81604783e+00, -1.78220593e+00,
2.03840781e+00, -3.78413946e+00, -2.92088276e+00, -3.27470588e+00,
-3.55507076e+00, -3.92475945e+00, 1.64645051e+00, 1.67869052e+00,
-3.93489661e+00, -2.81784497e+00, -3.68807719e-01, -2.23250527e+00,
-3.17145127e+00, -3.06848576e+00, 1.86554120e+00, -3.45172174e+00,
-1.69828941e+00, -4.02053660e+00, -1.55216846e+00, -2.02331411e+00,
-2.10571889e+00, -3.55905805e+00, -2.49898243e+00, -2.28172769e+00,
2.74490249e+00, -2.83363213e+00, 2.24344680e+00, -3.34701669e+00,
-8.73117509e-01, -3.23203164e+00, -1.12969037e+00, -7.66710924e-01,
-2.42153895e+00, -3.03895140e+00, -2.91987942e+00, 1.38494756e+00,
-3.39421968e+00, -3.69492981e+00, 3.03485488e+00, -3.95380733e+00,
1.23858636e+00, -3.62155657e+00, -1.43696292e+00, -1.35301786e+00,
-1.76964255e+00, -2.11275246e+00, 2.70103208e-01, -2.26912395e+00,
-3.79856601e+00, 5.86006565e-01, -2.09185051e+00, -2.56129182e+00,
-1.69170454e+00, -1.61023969e+00, -3.56971259e+00, -2.61289937e+00,
-2.75577998e+00, -3.28184406e+00, 1.87209519e+00, -3.74377756e+00,
-3.12619555e+00, -1.27544771e+00, 1.33989944e+00, 2.32283392e+00,
-3.13109006e+00, -1.96537252e+00, -3.05331955e+00, -2.43793540e+00,
-2.55122234e+00, -4.13310268e-01, -2.85020785e+00, -1.72151334e+00,
-1.60902398e+00, -3.46862644e-01, -9.80552452e-01, -3.63448238e+00,
-1.13306216e+00, -4.12241473e+00, -1.53219364e+00, 1.56421797e+00,
-2.08172521e+00, -1.34879210e+00, -3.07224323e+00, -4.07542645e+00,
-3.86488080e-02, -3.60820433e+00, -3.57799529e+00, -2.73214019e+00,
-3.61610256e+00, 2.15183593e+00, 1.74809702e+00, -1.82650762e+00,
-1.99124611e+00, -2.63180558e+00, 1.04160481e+00, -2.02234762e+00,
-8.15807940e-01, 6.42893951e-01, -3.73410375e-01, 2.11430839e+00,
-2.44344632e+00, 2.09025955e+00, -1.52648588e+00, 2.43937442e+00,
2.03310746e+00, -1.36519273e+00, -6.04920850e-01, -2.29616747e+00,
-2.59126663e+00, -3.05497750e+00, -1.74028573e+00, -3.12593453e-01,
2.43880936e+00, -2.45342178e+00, 2.52146975e-01, 1.39592665e+00,
1.80890493e+00, -3.53508091e-01, 1.19502960e+00, 1.08504420e+00,
 1.50096938e+00, 1.44393497e+00, 4.62586897e-02, -3.58475773e+00,
```

```
-3.24021284e+00, -1.96553421e+00, 1.37237330e+00, -8.56230707e-01,
-1.79133700e+00, 6.36965486e-01, 1.39610916e+00, 1.39556171e+00,
5.07826411e-01, -3.04067135e+00, 1.50202848e+00, -2.03975514e+00,
1.20609214e-01, -8.39925857e-01, -2.13448081e-01, -2.71385193e+00,
1.88939912e+00, -3.16084576e+00, -1.37759338e+00, -3.79394658e+00,
-3.02664313e-01, -1.36532238e+00, -8.91621511e-02, -2.17139254e+00,
-1.51573825e+00, -2.01448060e+00, -1.78514743e+00, -3.19765196e+00,
-2.68151552e+00, 7.52262692e-01, -3.97625920e+00, -2.61652907e+00,
1.59688685e+00, -1.87956113e+00, -4.06837318e+00, -3.25768522e+00,
-2.18867863e+00, -2.80072788e+00, -2.37633484e+00, -4.04514235e+00,
-3.74357961e+00, -2.95847417e+00, 6.62068809e-01, 1.47596836e+00,
-3.04037180e+00, 1.31436708e+00, -1.79395612e+00, -8.84102041e-01,
-2.04596201e+00, 1.81807472e-01, 9.83932381e-01, 1.64209331e+00,
7.58289981e-01, 8.69621057e-01, 1.81828388e+00, 4.13323277e-02,
-8.20990042e-01, -2.50768955e+00, -1.71361305e+00, -5.33810168e-01,
-1.26126651e+00, -3.78232911e+00, -1.66044536e+00, 9.18845084e-01,
-1.18113362e+00, -1.07427110e+00, -3.16335092e+00, -1.81510192e+00,
1.89797466e+00, 5.85081068e-05, -1.95382630e+00, -1.66390398e+00,
-1.04030736e+00, -3.20614798e+00, 1.77746833e-01, -3.45702001e+00,
-3.34834623e+00, -4.64423069e+00, -2.66322744e+00, -4.57845294e+00,
-3.44009101e+00, -1.50320150e+00, -2.49085765e+00, -2.01698725e+00,
1.94188311e+00, -3.81218025e+00, -4.02532535e+00, -1.70811138e+00,
1.64136319e+00, 7.99325626e-01, 2.05016555e+00, -3.38201940e+00,
-1.53875461e+00, -3.66721954e-01, -3.19010567e+00, -2.53031305e+00,
-2.37531356e+00, -2.27612266e+00, 1.27130088e+00, -1.15689719e+00,
-2.39209640e+00, -3.53683516e+00, -2.10365880e+00, -2.69698812e+00,
-3.39017970e+00, -1.66615777e+00, -1.57579631e-01, 1.36363599e+00,
-3.87588257e+00, 3.12625267e+00, 6.35691508e-01, -1.81932979e-01,
-2.26795952e+00, -3.80686201e+00, 1.14666159e+00, -1.95190733e+00,
2.13197294e+00, -1.40603285e+00, -1.70097113e+00, 1.98606733e+00,
-3.27261754e+00, -2.72939166e+00, -1.25084412e+00, 1.28602504e+00,
-2.70495341e+00, -8.20717096e-01, -2.28393755e+00, 1.58888194e+00,
-3.06295147e+00, -2.53251019e+00, 1.77453413e+00, -3.58263019e+00,
-2.04170335e+00, -1.30333613e+00, -7.12583516e-01, -3.56337731e+00,
-3.87765879e+00, 7.77261767e-01, 1.56824291e+00, 1.22433273e+00,
-2.08636204e+00, -2.97480810e+00, -2.64997658e+00, -2.81594277e+00,
-1.89601385e+00, -3.19295359e+00, 1.62336089e+00, 1.51663960e+00,
-2.25576746e+00, 9.18532125e-01, -9.48522406e-01, -2.95299402e+00,
-7.64239062e-01, -3.14566451e-01, -2.97252659e+00, -1.54613231e+00,
3.47815176e-01, 2.35776096e+00, -2.53086546e+00, -3.88656468e+00,
-2.35617126e+00, 1.72298736e+00, -2.48509720e+00, 1.24569012e+00,
-2.45782346e+00, 1.74787500e+00, 1.74519473e+00, 1.67062524e+00,
1.80428517e+00, -2.73892032e+00, -2.94593998e+00, 1.71301685e+00,
3.14760444e+00, 1.37555224e+00, -4.16860490e+00, -2.67287385e+00,
1.36564973e+00, 1.71732752e+00, 2.18090422e+00, -2.28698167e+00,
-2.33319603e+00, -2.79945838e+00, -4.17556625e+00, -2.16602266e+00,
 4.78450324e-02, 1.83154418e+00, -1.56121681e-01, 1.24869112e+00,
```

```
-3.32521416e+00, -2.85634575e+00, -3.05868759e+00, 1.44189036e+00,
             -2.17924529e+00, -2.68021122e+00, -2.82876443e+00, -2.81740623e+00,
              1.18356930e+00, -1.73832368e+00, 1.75981007e+00, -2.21087542e+00,
              1.36465437e+00, 2.40968476e+00, 7.47027924e-01, -2.31121548e+00])
[11]: | ftest=decision_function(X_test, weights, intercept, sv, gamma)
      print(ftest)
     [-3.345809139124959, 1.2812102150961455, -1.4676901557075506,
     1.7719641875960623, -1.6615762813865227, -2.691637685493411,
     -2.9431938969046665, -1.5864550732263534, 1.9781573566808892,
     -0.9330201642562268, -3.70357544124797, -0.32426131704614347,
     -2.8628247268966542, -1.9263742600311597, 1.6133941153625035,
     -2.3988541009155493, -3.0700141804373753, -1.7844714033561853,
     -3.0843693756199353, -0.7938921742583669, 0.5534545213387578,
     1.3428201913571276, 2.001468031861372, -1.7023465197826861,
     -0.09603178860645967, -3.461757491431093, -1.556140514658345, 2.351009582665917,
     -3.446070512137332, -3.2633577138091066, -2.016011465494351,
     -1.6740949256800444, -3.169658614917999, -2.976726283213018,
     -2.8483263828754057, -2.1813434445772866, -2.39067783103966, -4.632557778157057,
     1.0106063050127507, -2.0603948252261755, -2.776042054419569,
     -1.9396758441991078, -2.6919833578245895, 2.9992418692540004,
     -1.7368834953523797, 0.4718946009865239, 1.3710440039157636, -4.430219648429578,
     -2.7958379832782394, -2.7881651344730822, -3.691870053239604,
     -2.600045057388591, 1.1302657803455323, -3.8672650743793535,
     0.08639048606550448, -2.4838074426738994, 2.610744249714735, 0.5109032898148844,
     -1.062432424154046, -1.5573879823497587, -2.193104503584969,
     -1.0199212112952618, 1.7588988085685533, -2.827981983382933, -2.497819615494272,
     -3.3376973690908396, 1.4428107452669043, 0.2400565196269544,
     -2.8644197527230584, 1.3297716671245117, -1.699137162187959,
     -2.6382920923147917, -2.7867935005662257, -1.9308695850163597,
     0.12393437260788476, -2.2398161713425035, -2.698179075776785,
     -1.5502425604808177, -2.696925349717254, -1.653815413739657, -2.772803306862279,
     -3.984646297516313, -3.113437386939729, 0.5440720768514571, -3.1360691296891257,
     2.0048021992104386, -3.1100130964016652, -1.4466766353738403,
     -0.2483423913563665, -3.9994963882070276, -2.0190172142456855,
     -2.3378564828963344, -1.6205835932261645, -3.427142046288402,
```

-2.656496907500347, -2.165921217470092, -0.6333126326340799, -4.761146638703785,

```
-2.2777488621934547, 2.5003198815207743, -0.6584379320481513,
1.7843493569388262, -0.5874888713193438, -2.623391575328433, -4.247258353321307,
-1.3225663110976238, -2.112296728507182, 1.14471949415745, -3.3056956275944525,
3.056807498031923, -3.3345471514851037, -2.395279128048649, -2.147947119570794,
-2.481722747874421, -2.4425568755934033, -0.9374489013599923,
-3.408441982539592, -3.03087435120765, -3.5469124514645425, 1.908078223935711,
0.5998970113640572, 0.44833815516623376, -2.2954160528044905,
-3.0012610395502075, -2.752283800543061, -3.7439321898752733,
-3.5690894839919234, -2.6302894719922487, -2.159022099342017,
-3.671990790675998, -2.3272819770191613, 0.3234224169186395, -1.726101784395929,
-2.536142829054391, -2.000687386170902, -3.6818929980084145, -3.368024381863641,
1.8009323599361058, 0.6848277758316006, -1.4320770763605064, -2.298262489954332,
2.324479912945215, -2.574663380502805, -3.2583611868491213, 1.889185676180269,
-3.2099587197768, 0.10139095724073188, -2.8734486167089197, -1.311086880374965,
-2.699891887439868, 0.29797539999589917, -3.0779275375217234,
-4.627191257931237, -2.7434589527967357, -1.2629454357542254,
-0.026103210102938146, -2.493055462108891, -3.953351839297461,
-0.8404835087441636, -1.4969411949344713, -1.7564772411283296,
1.727076320756645, -2.042227535139808, -1.7594840483413559, -2.6129063504323606,
-3.7462273792114966, -3.598009117277051, 0.7513751715020409,
-2.3469325685302276, -1.356559447593717, -3.1480281688003156,
1.1213318645026011, -4.198912585628513, 1.9463722643514179, -2.9474075904799757,
-2.3770468459124667, -2.112301496823427, -2.5351672637186975,
-2.6893690739644636, -2.5690144356187328, -2.727976456120721,
-3.9479675915074846, -3.8428873861736927, 0.2417919117278804,
-4.061731683613665, -1.4204219023428304, -4.144716269217902, 2.083037223545141,
-2.1130343220600234, 1.9134529362029657, -2.0527886186021145,
-3.503608102257352, -4.696607975499397, -3.271999150362752, -2.4911573557555253,
-3.3963804195774894, -3.3034810676748445, 1.4130616645841987,
-1.383956556395709, -2.852415980616534, -3.1126589911818097, -2.262483468666637,
-3.123463403383162, -3.474789881244113, -1.5174256644870705, 1.7423677078515785,
-1.3966571472326659, -2.9090302208188556, -2.8016500575552423,
1.6662790329830064, 1.9362666108417632, -2.1559744610857403, 2.1467726842272374,
-2.4131106565247147, 2.271175145284737, -2.667970739319507,
-0.15157645549448473, -3.13353198253926, -0.2210375601888681,
-2.7190276854600977, -2.5821028182499144, -1.113889641545334,
1.8766473632638498, -1.2135537280624997, -1.7081737607785992, 1.622729355143854,
-1.7821684373442461, -0.5405933102985823, -2.0974982082654274,
1.6821626169095443, 1.3225437495413463, 0.0774771680471038, 2.3087328384518107,
-2.7183240075411486, 1.4680353246535351, -2.351898579112962,
-2.5553795667618355, -2.5410804588375764, -1.8016640134880855,
-1.559907374344227, -3.384189051571418, -1.7160209320293016,
-3.0676319987885914, 1.2207502633166816, 1.564445783887145, -0.2095681410692758,
0.4229263335937721, -3.7920162662989365, -2.595680681054638,
-2.0798434039991274, -3.4970849692412496, 1.3041620038108381,
-3.5700021895753262, 1.2731578627467361, -2.3435977804723147,
-2.0885433289971966, -3.7927251020037924, 0.4392876509669823,
-3.1206664151409096, -2.72069575712252, 0.6975364406844524, 1.0675004424442212,
```

```
-3.8529258404034077, -3.834164350704078, 1.8275120435901404,
-2.5483242367350907, 1.2515245607479888, -0.22009941204125694,
-2.2864479108355122, -3.354442058031132, 0.24399455619181554,
-2.4854340364973875, 1.7052591922007356, -2.919995198635298,
-1.8532758473656865, -1.6469840820222355, -1.6391118609408362,
1.7149088541768198, -1.6053847556440455, -3.5128015182109986,
-2.6603068691911527, -2.0606091464166307, 1.7211025398646673,
-1.0916105747273046, -2.4686246439198736, -3.5042355194731196,
1.655286431703907, -1.7573235997273495, -0.4999344747872878,
0.44536080634862474, -3.104749084724069, -1.6116908977936855,
-2.209251624015685, -2.7270916458646677, -0.6175997523768539,
-1.5833292325560318, -0.3697127572716208, -1.140031428589729,
1.7751168093989311, -1.8637780971396505, 0.13779024337056756,
-3.586681995784779, -2.333933007281068, -2.322375092310018, -1.8087646445740755,
0.9982904924383083, -2.59500725945427, -1.630850825320898, 0.6998128635398122,
-1.8830021749344392, 1.7956590706244033, -4.16211991862189, -1.3595206362201036,
-0.6701870849677287, -3.104284771992233, -0.7443643538356279,
0.01797239265186379, 1.30393493866135, 2.4117533457551805, 0.13999827730510406,
-4.153430679395434, -4.611328912691569, -3.198696897251487, -2.8369390321747043,
-1.4446236029694783, -2.566971996298029, -1.9912154006215341,
-3.5477689023864154, -3.4447575987200234, -2.670317648589467,
-2.9719231278203675, -2.9118740667915755, -0.6749447752734379,
0.5723704488861405, -3.115393187946857, -4.261340966423852,
-0.37132573787273015, -0.7957160215647785, -2.9105229925214853,
-2.35218689858258, -3.2084081775850772, -6.5675810171824835,
-1.4618097050966052, 0.7051594963906145, -2.8917648260433917,
-1.3861329440251562, -0.24934661491945276, 2.2418084863937016,
-2.715689277160656, 1.4654543076602313, -1.417533289342607, 2.2197502852022173,
-3.3312536695598918, -4.291880644325111, -3.3709537251910358,
1.7906960411989492, -2.269300555779871, -3.8769076582735447,
-2.5828934679416373, -1.7164322793534335, -1.310174958689593,
-1.6866410731707826, -2.2355276800531594, -2.2078034047866093,
-1.2370463944801098, -1.4045777137186302, -0.3816610528097111,
-2.6269169985895284, -3.052331351349188, 1.0346069418728026,
0.30608058127162296, 0.08831008403334595, -2.2382840272984406,
0.6392300881230217, -2.3589027152812245, 1.215562840324488, -4.822865820069929,
-0.22148386000181786, -0.6106508178511159, -2.716387074142794,
-2.243316277667382, 1.7618243735255636, -1.7645951700116664,
-2.2756045998239567, 1.8110596503196565, -3.904987241539153,
-0.2985024658683453, 0.8752370158069387, -3.856725550845702, -2.72570198669846,
-2.3207547924809897, 1.4048668422137998, 0.2062167283993479, 1.759362914081898,
-2.2989249519663626, -2.952824691509256, -3.224008525356474,
-0.24283683309430826, -1.2683617065265405, 1.8280336220795097,
-2.2943163676413074, -1.6335229223322396, 1.3162950764701056,
-2.903173832585473, -1.476067919751379, 1.5861705693248287, -2.6890776363144435,
-3.7982592250595455, -2.6304520314115716, -0.751741161194722,
-3.428618978789707, -1.6948478366430701, 1.182323414204355, -2.269823674679692,
-1.7546432468333601, -1.22891648791127, -2.3376951233995764,
```

```
-2.4128826631087956, -2.5468419259953303, 0.5987783994762386,
-1.591229467480097, -2.3662400549873506, -1.6682007650496966,
-4.051827942910769, -1.360717257745598, -3.067498003827715, 0.6683126638291346,
1.4242504321654157, -2.0586990618838636, -2.1838346408942395,
1.8696463842933118, -3.2122228413135683, -2.8305676383359137,
-3.9558975862630557, 1.800014386226302, -0.6289984463867238, -2.908519998435174,
-5.114240731583671, -2.3970284495384884, -1.5931540712972416, 1.736745739373156,
-3.9823614708787356, 1.0844421142466207, -2.1594570489180493,
-2.7763920440404557, -1.3266528906077393, 1.5172626171194072,
-2.337272100428826, -3.1918908478064405, 2.2640989658212836,
-1.2982622214537893, 0.6545475423315215, 1.4585290287496595, 1.5925970945910923,
0.6934992050336821, -1.9386876385140606, -1.8824672695018658,
-2.2517029383870475, -1.6017594370316242, -2.440354356827505,
-3.3295428382848438, -2.0286531836992405, -0.8685122544471038,
-3.760909291169717, -2.9578009740808606, -3.5112474865281835, 1.373626813066132,
-1.7116441858402065, 2.6080338701881307, 3.7656461441648266, -2.732918509528765,
-1.8169250059369015, -3.970417994954793, 0.6794139162860025, -3.154848439782675,
-1.7013478560821862, -2.4875760210620323, 1.8891863387593806,
-2.352904640388878, -1.3904666135215602, -2.368431732941367, 1.1531195265402023,
-1.9582939301704054, -3.9443198620257145, -1.7288296548129334,
-0.9159704270499485, -0.5076237592342134, 1.5366338840764162,
-1.0377314279614533, -3.058712170229803, -3.1177688749928687,
-2.7752038319473153, 2.854485542533887, -1.7589064864944173, 1.7075977558154354,
-2.1040122047398095, -3.141727545098284, -1.280996935453636,
-2.2999423606583984, -2.8460009774182633, -1.9322528213907542,
1.8226849473049147, 2.565803336469465, -1.2287975548592196, -1.97332515998314,
-0.07836430426255658, 2.117718932036461, -2.7202747881392564,
-2.801958112683699, -1.7600404288181504, -1.7082187375277935,
1.7325007155189742, 1.5318725888355336, -0.6603394878320965,
-1.7598005620727046, -0.253110648980829, 1.4853361223673365,
-2.0458787997324133, -1.3408830090441834, 2.0979142796635775,
-0.4924733363978713, 1.2506091170715554, -1.16384674135201, -0.9059646243182082,
-1.55071007059751, 1.7409758785113287, -3.484062425840555, -0.7437852872629587,
-1.4526450676725697, 0.2561248995520704, -2.344666588359963, 1.3231125255970189,
-4.111405105612398, 1.2314994510210444, -4.035868754162429, -3.95916662317159,
-2.1211049635559145, 1.4950819143390324, 1.945817335922691, -1.0891305945321572,
-2.8325416520673268, -3.2025978442646514, 1.9461669338354075, 1.47276512543035,
1.5323946910829211, -3.966294329150251, 3.5970241574005475, 1.2931410550277112,
-3.434055318977975, -2.5829058645162557, -2.3866484912629526, 1.948280727414279,
1.1397015492408902, -0.44437814790766295, -2.485717880515018,
-2.275264653797954, 0.46538106124715073, -2.2421695941621276,
-2.744203132868513, -2.683045357491799, -1.272446433060615, -2.267325366160612,
0.7660853221187343, 1.7228380675978703, -3.28396492397875, -2.2781586759318837,
-3.4330324429465615, -2.5932454641026292, 0.48986369090416604,
-2.645264816698393, -2.2365608440946185, -3.114330875592351,
-3.7983278456135348, 1.846462083385156, -2.037152697225103, -3.849559767596183,
-2.478055189647655, 3.133530186113014, -1.0762196034365625, 0.4047160196673123,
-2.428580021775566, 2.030308600533012, 0.20533724982855306, -3.296984840554067,
```

```
-2.9560144853512393, -1.9961808384110422, -3.682157859095461, -3.02263161492916,
-2.997511943368543, -1.317607761008737, 1.8488119518980928, 1.3736581308390545,
-2.8739825535400096, -2.110926514964923, -1.9372260670884809,
-2.3291218740664514, -0.8502044989587527, -3.578201007386262,
-2.1777929144156114, -2.3929343620187704, 1.9782614115673813,
1.9476462491994302, 1.532287139749592, 1.45426225502839, 2.478181488906323,
1.1994610205145126, 1.6787948378847735, -2.7608374024736615,
-1.9208664640442303, 0.8261689385702415, -3.9708065867756583,
-2.7797918662531553, 0.8067946818629044, -2.3710162731112017,
-1.7121570869974998, -0.9698326716643986, 0.507169311166344,
-0.7872723413603562, -0.6372494779297067, 1.4842556065352928,
-2.999695040491367, 1.3986062331566917, -1.378320654012064, -4.051877180933566,
-2.680427550027353, -3.4355962754652647, 1.556858809119881, 1.5978203688791912,
-1.67749745244496, 0.11591998366918022, 0.7756361896737975, -2.401371317053808,
-2.8251818369285995, -1.4181547743440812, 1.1623426249428737,
-3.0690535528734624, -1.657589516930734, -3.836378185212673,
-2.3210143656505475, -1.4852922002447921, -1.3077852973377229,
1.7334491184134824, -3.330966174201641, -0.5931967277611601,
-0.7744877400114158, 1.742891892289244, -2.632273032329955, -2.658926815964555,
1.9903798627999056, 0.29034491626415404, 2.062778187786741, -3.758050679407098,
1.55849964955727, -0.36324874568096943, -3.461772905658584, -1.5890099674408087,
-1.5105905788766942, -0.985249084390666, 1.6097976961636324, -1.229420018405015,
1.1187719666977434, 0.5311142738425976, -2.0489275184737106,
-0.2827978786399892, -0.35597017675591003, -2.7669588826508895,
1.6072040415390139, -1.6775797090859252, -2.7150074444764196,
-0.9642009235406657, -2.8815753385711456, -2.7732953561677145,
-2.337423804983153, -2.582769465950754, -4.037979510502957, -1.1238737705728066,
-0.9765695529808265, -2.2874029899316137, -1.4465294839409562,
-1.6696935670570165, -0.7000811168024437, -2.6858706334125553,
2.2244550101594958, -3.4942477395533795, -3.3579703348653775,
-0.22286916148878033, -3.12150356641613, -2.439628633474818,
-3.1802397462549474, -2.51565954964267, 1.8214138841759753, 1.364750017071565,
-3.38354693614864, -1.5072922540108844, -2.7480299741738103,
0.26004972313457886, 1.275998512959227, -3.0473504479606457,
-1.8157137859117038, -2.810287704527631, 1.4536546251406084,
-3.2284382930655577, -2.7839755717732895, 0.05382283692404899,
2.373074705243177, 1.5399003414898478, -4.043470974266803, -2.5296876401685675,
-3.1259136765489255, -3.1401177341155697, 1.6439738847447605,
2.3076944817321636, -1.1034681953953718, -2.673685458216219,
-1.0036332806590518, -2.2556420917122675, -4.222169400979645,
1.3568798134296363, -2.209306432318733, -5.314018588370423, -3.773658170564978,
-2.434605013347585, -2.828980443190282, -0.5201289424573541, -2.014878925366268,
1.6604071421065858, -2.286530275441329, -1.8663385437071223,
-1.0408109304643527, -0.4974876299418365, -3.131653395102553,
0.5426618162964378, -2.7147565976698966, -2.170447516236201, 1.8380740521677912,
0.79345497506467, 0.19294305434355197, 0.5357930696796775, -1.719462833009707,
-1.854327294544937, -3.5985106670119715, -1.5035459018733301,
1.4256186158182023, -2.9648256780822133, -2.2004957609224145,
```

```
2.0600409463583778, -0.3456469978874064, -2.272780181662419,
-3.6611187288328817, 1.3255536604048577, 1.6573366260638882, -2.969234472424936,
2.3224755590179673, 1.0475589638518206, -2.248748083856419, -2.71081959933101,
1.53872605683727, 0.5891788795346931, -3.7013818188786796, -2.2170966847940217,
3.5782386409478097, -1.993965919839702, -1.5510481974767951, -2.666105326949143,
-2.8007316750040228,\ 1.8342508871427374,\ -2.87535084900265,\ 1.6244717531253987,
-3.0399048852302353, -1.722035310737787, 1.85383874849385, -0.4182709127219435,
1.8385055446562792, -3.765894798136166, -2.9553058990438994, 0.3374287916829606,
-1.307843526608472, -2.3687280335124465, 1.3620373826234347, -1.558530747150321,
-3.0435504015718844, 1.8122298350614234, 0.6004712327210133, -4.086708791907775,
-2.709941459405463, -3.1434264163495906, 0.8868359281859388, 1.428514289592251,
-3.0607103313414608, -4.40388599916988, -0.8376454821747141,
0.27961189100887696, -0.6944212040775208, -0.6787676383113204,
1.0377714347856046, -0.5337298130385402, 0.777366901186817, -4.563748152865067,
-2.035916073735471, -0.8642379483226885, -0.5205045159035602,
-2.9034418820453634, -5.486545003576062, -2.4709702542160765,
-1.5213350409737454, -2.481933258321582, 0.15693085571529553,
1.6264233001132102, -0.12516150709357232, -2.1157832280462894,
-1.4224055866930239, -3.0881304351311125, 0.167342802647362, 1.5043354874418147,
1.7428578037421052, -0.24579931876538508, 2.3693496019210376,
-2.921707940249497, 1.5877379588042762, -0.2842489520137188, 1.8239673662451072,
3.5555924595051853, 2.3818848689055376, -2.3034544189938297, 0.533276821226075,
0.9138608420961067, 1.5976484289424993, -3.832138524907968, 0.12306831232296433,
1.9628735148640364, 0.9422282945899174, -3.2924376972468603, 1.49846368646508,
-4.83198875168852, -2.866701138646142, 1.5494100101883466, 1.5048256365991581,
-1.7138007542926839, -1.8717141567937925, -2.9327518033337507,
2.8615567935488646, 2.402871511216994, -0.36327407268597467, -2.954668697303084,
-2.9523984928719567, -3.6689191138003063, 2.0530568106626323,
-2.7936554638531486, -4.553067080273728, 1.2944113269578073,
-2.3630210746235956, 3.1786300526689435, -3.2397256389053903,
-4.126848331779023, -0.7937641176512424, -3.0054081631128393,
0.6431777615495027, -2.9687062367225177, -2.9510046794737472,
-3.170877012028576, -4.017861169779728, -3.1303319565133942, -4.416710372590437,
1.460635204538868, -1.1803412997338607, -2.016150403316906, 1.5624536521165386,
-0.6708246686934909, -3.592854410636398, -3.075751779028898,
-3.2518254519579055, 1.0078863795959383, -3.667108891390931, 1.8842051057317168,
-1.7545293002419338, -2.643579137566355, -3.7363178408255986,
-3.9190829272409853, 2.316730227703666, 2.157509127926524, -1.9140286281174421,
0.8021263647584438, -4.596828088603168, 1.9235820501689394, 0.7099970787008307,
-1.6226575968272452, -2.092110865551241, -3.0610352986868103,
-4.011329038349523, -1.9350414039220634, -3.528263505670601, 1.91080475996467,
1.6261041927002045, -1.7674548277772497, -3.1488800525751723,
-2.2373755691488877, -2.4430118718243317, 1.862668209999804,
-2.4239607594935317, -3.605752330901289, 1.9027000069159716, 1.0460983776875783,
-2.002171874396772, -2.9669461171170535, 0.8016105668023461, -3.856723756735341,
-1.7661306775747998, -1.895092877160756, -1.7568813462002093,
-0.9847731133428321, 1.554743600642532, -2.4863234398062484, -2.379469355444662,
-1.7896580059678011, -2.226971282273673, -2.0659692719105673,
```

## [12]: clf.decision\_function(X\_test)

```
[12]: array([-3.34580914, 1.28121022, -1.46769016, 1.77196419, -1.66157628,
            -2.69163769, -2.9431939, -1.58645507, 1.97815736, -0.93302016,
            -3.70357544, -0.32426132, -2.86282473, -1.92637426, 1.61339412,
            -2.3988541 , -3.07001418 , -1.7844714 , -3.08436938 , -0.79389217 ,
             0.55345452, 1.34282019, 2.00146803, -1.70234652, -0.09603179,
            -3.46175749, -1.55614051, 2.35100958, -3.44607051, -3.26335771,
            -2.01601147, -1.67409493, -3.16965861, -2.97672628, -2.84832638,
            -2.18134344, -2.39067783, -4.63255778, 1.01060631, -2.06039483,
            -2.77604205, -1.93967584, -2.69198336, 2.99924187, -1.7368835,
             0.4718946, 1.371044, -4.43021965, -2.79583798, -2.78816513,
            -3.69187005, -2.60004506, 1.13026578, -3.86726507, 0.08639049,
            -2.48380744, 2.61074425, 0.51090329, -1.06243242, -1.55738798,
            -2.1931045, -1.01992121, 1.75889881, -2.82798198, -2.49781962,
            -3.33769737, 1.44281075, 0.24005652, -2.86441975, 1.32977167,
            -1.69913716, -2.63829209, -2.7867935, -1.93086959, 0.12393437,
            -2.23981617, -2.69817908, -1.55024256, -2.69692535, -1.65381541,
            -2.77280331, -3.9846463, -3.11343739, 0.54407208, -3.13606913,
             2.0048022 , -3.1100131 , -1.44667664, -0.24834239, -3.99949639,
            -2.01901721, -2.33785648, -1.62058359, -3.42714205, -2.65649691,
            -2.16592122, -0.63331263, -4.76114664, -2.27798351, -3.63746908,
            -1.91990422, -3.61979879, 3.82569851, 1.83122636, 1.22019042,
            -0.90956913, -1.99542718, -4.02643595, 1.37548827, -1.7859927,
            -2.77950235, 1.75636239, -2.60547741, -1.71728249, -2.88811283,
            -3.13337094, -2.521209 , 0.06318636, 1.52625458, 0.37301307,
             1.37305468, 0.30321625, -3.3362917, -0.93735978, 2.04960142,
            -1.07017306, 1.19553707, -1.03970437, -1.79873929, -2.77607626,
            -2.54269386, -2.27774886, 2.50031988, -0.65843793, 1.78434936,
            -0.58748887, -2.62339158, -4.24725835, -1.32256631, -2.11229673,
             1.14471949, -3.30569563, 3.0568075, -3.33454715, -2.39527913,
```

```
-2.14794712, -2.48172275, -2.44255688, -0.9374489 , -3.40844198,
-3.03087435, -3.54691245, 1.90807822, 0.59989701, 0.44833816,
-2.29541605, -3.00126104, -2.7522838, -3.74393219, -3.56908948,
-2.63028947, -2.1590221 , -3.67199079, -2.32728198, 0.32342242,
-1.72610178, -2.53614283, -2.00068739, -3.681893 , -3.36802438,
1.80093236, 0.68482778, -1.43207708, -2.29826249, 2.32447991,
-2.57466338, -3.25836119, 1.88918568, -3.20995872, 0.10139096,
-2.87344862, -1.31108688, -2.69989189, 0.2979754, -3.07792754,
-4.62719126, -2.74345895, -1.26294544, -0.02610321, -2.49305546,
-3.95335184, -0.84048351, -1.49694119, -1.75647724, 1.72707632,
-2.04222754, -1.75948405, -2.61290635, -3.74622738, -3.59800912,
0.75137517, -2.34693257, -1.35655945, -3.14802817, 1.12133186,
-4.19891259, 1.94637226, -2.94740759, -2.37704685, -2.1123015,
-2.53516726, -2.68936907, -2.56901444, -2.72797646, -3.94796759,
-3.84288739, 0.24179191, -4.06173168, -1.4204219, -4.14471627,
2.08303722, -2.11303432, 1.91345294, -2.05278862, -3.5036081,
-4.69660798, -3.27199915, -2.49115736, -3.39638042, -3.30348107,
1.41306166, -1.38395656, -2.85241598, -3.11265899, -2.26248347,
-3.1234634 , -3.47478988 , -1.51742566 , 1.74236771 , -1.39665715 ,
-2.90903022, -2.80165006, 1.66627903, 1.93626661, -2.15597446,
2.14677268, -2.41311066, 2.27117515, -2.66797074, -0.15157646,
-3.13353198, -0.22103756, -2.71902769, -2.58210282, -1.11388964,
1.87664736, -1.21355373, -1.70817376, 1.62272936, -1.78216844,
-0.54059331, -2.09749821, 1.68216262, 1.32254375, 0.07747717,
2.30873284, -2.71832401, 1.46803532, -2.35189858, -2.55537957,
-2.54108046, -1.80166401, -1.55990737, -3.38418905, -1.71602093,
-3.067632 , 1.22075026 , 1.56444578 , -0.20956814 , 0.42292633 ,
-3.79201627, -2.59568068, -2.0798434, -3.49708497, 1.304162,
-3.57000219, 1.27315786, -2.34359778, -2.08854333, -3.7927251,
0.43928765, -3.12066642, -2.72069576, 0.69753644, 1.06750044,
-3.85292584, -3.83416435, 1.82751204, -2.54832424, 1.25152456,
-0.22009941, -2.28644791, -3.35444206, 0.24399456, -2.48543404,
1.70525919, -2.9199952, -1.85327585, -1.64698408, -1.63911186,
1.71490885, -1.60538476, -3.51280152, -2.66030687, -2.06060915,
1.72110254, -1.09161057, -2.46862464, -3.50423552, 1.65528643,
-1.7573236 , -0.49993447, 0.44536081, -3.10474908, -1.6116909 ,
-2.20925162, -2.72709165, -0.61759975, -1.58332923, -0.36971276,
-1.14003143, 1.77511681, -1.8637781, 0.13779024, -3.586682,
-2.33393301, -2.32237509, -1.80876464, 0.99829049, -2.59500726,
-1.63085083, 0.69981286, -1.88300217, 1.79565907, -4.16211992,
-1.35952064, -0.67018708, -3.10428477, -0.74436435, 0.01797239.
1.30393494, 2.41175335, 0.13999828, -4.15343068, -4.61132891,
-3.1986969 , -2.83693903 , -1.4446236 , -2.566972 , -1.9912154 ,
-3.5477689, -3.4447576, -2.67031765, -2.97192313, -2.91187407,
-0.67494478, 0.57237045, -3.11539319, -4.26134097, -0.37132574,
-0.79571602, -2.91052299, -2.3521869, -3.20840818, -6.56758102,
-1.46180971, 0.7051595, -2.89176483, -1.38613294, -0.24934661,
```

```
2.24180849, -2.71568928, 1.46545431, -1.41753329, 2.21975029,
-3.33125367, -4.29188064, -3.37095373, 1.79069604, -2.26930056,
-3.87690766, -2.58289347, -1.71643228, -1.31017496, -1.68664107,
-2.23552768, -2.2078034, -1.23704639, -1.40457771, -0.38166105,
-2.626917 , -3.05233135, 1.03460694, 0.30608058, 0.08831008,
-2.23828403, 0.63923009, -2.35890272, 1.21556284, -4.82286582,
-0.22148386, -0.61065082, -2.71638707, -2.24331628, 1.76182437,
-1.76459517, -2.2756046, 1.81105965, -3.90498724, -0.29850247,
0.87523702, -3.85672555, -2.72570199, -2.32075479, 1.40486684,
0.20621673, 1.75936291, -2.29892495, -2.95282469, -3.22400853,
-0.24283683, -1.26836171, 1.82803362, -2.29431637, -1.63352292,
1.31629508, -2.90317383, -1.47606792, 1.58617057, -2.68907764,
-3.79825923, -2.63045203, -0.75174116, -3.42861898, -1.69484784,
1.18232341, -2.26982367, -1.75464325, -1.22891649, -2.33769512,
-2.41288266, -2.54684193, 0.5987784, -1.59122947, -2.36624005,
-1.66820077, -4.05182794, -1.36071726, -3.067498 , 0.66831266,
1.42425043, -2.05869906, -2.18383464, 1.86964638, -3.21222284,
-2.83056764, -3.95589759, 1.80001439, -0.62899845, -2.90852
-5.11424073, -2.39702845, -1.59315407, 1.73674574, -3.98236147,
1.08444211, -2.15945705, -2.77639204, -1.32665289, 1.51726262,
-2.3372721 , -3.19189085, 2.26409897, -1.29826222, 0.65454754,
1.45852903, 1.59259709, 0.69349921, -1.93868764, -1.88246727,
-2.25170294, -1.60175944, -2.44035436, -3.32954284, -2.02865318,
-0.86851225, -3.76090929, -2.95780097, -3.51124749, 1.37362681,
-1.71164419, 2.60803387, 3.76564614, -2.73291851, -1.81692501,
-3.97041799, 0.67941392, -3.15484844, -1.70134786, -2.48757602,
1.88918634, -2.35290464, -1.39046661, -2.36843173, 1.15311953,
-1.95829393, -3.94431986, -1.72882965, -0.91597043, -0.50762376,
1.53663388, -1.03773143, -3.05871217, -3.11776887, -2.77520383,
2.85448554, -1.75890649, 1.70759776, -2.1040122, -3.14172755,
-1.28099694, -2.29994236, -2.84600098, -1.93225282, 1.82268495,
2.56580334, -1.22879755, -1.97332516, -0.0783643, 2.11771893,
-2.72027479, -2.80195811, -1.76004043, -1.70821874, 1.73250072,
1.53187259, -0.66033949, -1.75980056, -0.25311065, 1.48533612,
-2.0458788, -1.34088301, 2.09791428, -0.49247334, 1.25060912,
-1.16384674, -0.90596462, -1.55071007, 1.74097588, -3.48406243,
-0.74378529, -1.45264507, 0.2561249, -2.34466659, 1.32311253,
-4.11140511, 1.23149945, -4.03586875, -3.95916662, -2.12110496,
 1.49508191, 1.94581734, -1.08913059, -2.83254165, -3.20259784,
1.94616693, 1.47276513, 1.53239469, -3.96629433, 3.59702416,
1.29314106, -3.43405532, -2.58290586, -2.38664849, 1.94828073,
1.13970155, -0.44437815, -2.48571788, -2.27526465, 0.46538106,
-2.24216959, -2.74420313, -2.68304536, -1.27244643, -2.26732537,
0.76608532, 1.72283807, -3.28396492, -2.27815868, -3.43303244,
-2.59324546, 0.48986369, -2.64526482, -2.23656084, -3.11433088,
-3.79832785, 1.84646208, -2.0371527, -3.84955977, -2.47805519,
3.13353019, -1.0762196, 0.40471602, -2.42858002, 2.0303086,
```

```
0.20533725, -3.29698484, -2.95601449, -1.99618084, -3.68215786,
-3.02263161, -2.99751194, -1.31760776, 1.84881195, 1.37365813,
-2.87398255, -2.11092651, -1.93722607, -2.32912187, -0.8502045,
-3.57820101, -2.17779291, -2.39293436, 1.97826141, 1.94764625,
1.53228714, 1.45426226, 2.47818149, 1.19946102, 1.67879484,
-2.7608374 , -1.92086646, 0.82616894, -3.97080659, -2.77979187,
0.80679468, -2.37101627, -1.71215709, -0.96983267, 0.50716931,
-0.78727234, -0.63724948, 1.48425561, -2.99969504, 1.39860623,
-1.37832065, -4.05187718, -2.68042755, -3.43559628, 1.55685881,
1.59782037, -1.67749745, 0.11591998, 0.77563619, -2.40137132,
-2.82518184, -1.41815477, 1.16234262, -3.06905355, -1.65758952,
-3.83637819, -2.32101437, -1.4852922 , -1.3077853 , 1.73344912,
-3.33096617, -0.59319673, -0.77448774, 1.74289189, -2.63227303,
-2.65892682, 1.99037986, 0.29034492, 2.06277819, -3.75805068,
1.55849965, -0.36324875, -3.46177291, -1.58900997, -1.51059058,
-0.98524908, 1.6097977, -1.22942002, 1.11877197, 0.53111427,
-2.04892752, -0.28279788, -0.35597018, -2.76695888, 1.60720404,
-1.67757971, -2.71500744, -0.96420092, -2.88157534, -2.77329536,
-2.3374238, -2.58276947, -4.03797951, -1.12387377, -0.97656955,
-2.28740299, -1.44652948, -1.66969357, -0.70008112, -2.68587063,
2.22445501, -3.49424774, -3.35797033, -0.22286916, -3.12150357,
-2.43962863, -3.18023975, -2.51565955, 1.82141388, 1.36475002,
-3.38354694, -1.50729225, -2.74802997, 0.26004972, 1.27599851,
-3.04735045, -1.81571379, -2.8102877, 1.45365463, -3.22843829,
-2.78397557, 0.05382284, 2.37307471, 1.53990034, -4.04347097,
-2.52968764. -3.12591368. -3.14011773. 1.64397388. 2.30769448.
-1.1034682 , -2.67368546 , -1.00363328 , -2.25564209 , -4.2221694 ,
1.35687981, -2.20930643, -5.31401859, -3.77365817, -2.43460501,
-2.82898044, -0.52012894, -2.01487893, 1.66040714, -2.28653028,
-1.86633854, -1.04081093, -0.49748763, -3.1316534, 0.54266182,
-2.7147566, -2.17044752, 1.83807405, 0.79345498, 0.19294305,
0.53579307, -1.71946283, -1.85432729, -3.59851067, -1.5035459,
1.42561862, -2.96482568, -2.20049576, 2.06004095, -0.345647
-2.27278018, -3.66111873, 1.32555366,
                                      1.65733663, -2.96923447,
2.32247556, 1.04755896, -2.24874808, -2.7108196, 1.53872606,
0.58917888, -3.70138182, -2.21709668, 3.57823864, -1.99396592,
-1.5510482, -2.66610533, -2.80073168, 1.83425089, -2.87535085,
1.62447175, -3.03990489, -1.72203531, 1.85383875, -0.41827091,
 1.83850554, -3.7658948, -2.9553059, 0.33742879, -1.30784353,
-2.36872803, 1.36203738, -1.55853075, -3.0435504, 1.81222984,
0.60047123, -4.08670879, -2.70994146, -3.14342642, 0.88683593,
1.42851429, -3.06071033, -4.403886, -0.83764548, 0.27961189,
-0.6944212 , -0.67876764 , 1.03777143 , -0.53372981 , 0.7773669 ,
-4.56374815, -2.03591607, -0.86423795, -0.52050452, -2.90344188,
-5.486545 , -2.47097025 , -1.52133504 , -2.48193326 , 0.15693086 ,
1.6264233 , -0.12516151, -2.11578323, -1.42240559, -3.08813044,
0.1673428 , 1.50433549, 1.7428578 , -0.24579932, 2.3693496 ,
```

```
-2.92170794, 1.58773796, -0.28424895, 1.82396737, 3.55559246,
2.38188487, -2.30345442, 0.53327682, 0.91386084, 1.59764843,
-3.83213852, 0.12306831, 1.96287351, 0.94222829, -3.2924377,
1.49846369, -4.83198875, -2.86670114, 1.54941001, 1.50482564,
-1.71380075, -1.87171416, -2.9327518, 2.86155679, 2.40287151,
-0.36327407, -2.9546687, -2.95239849, -3.66891911, 2.05305681,
-2.79365546, -4.55306708, 1.29441133, -2.36302107, 3.17863005,
-3.23972564, -4.12684833, -0.79376412, -3.00540816, 0.64317776,
-2.96870624, -2.95100468, -3.17087701, -4.01786117, -3.13033196,
-4.41671037, 1.4606352, -1.1803413, -2.0161504, 1.56245365,
-0.67082467, -3.59285441, -3.07575178, -3.25182545, 1.00788638,
-3.66710889, 1.88420511, -1.7545293, -2.64357914, -3.73631784,
-3.91908293, 2.31673023, 2.15750913, -1.91402863, 0.80212636,
-4.59682809, 1.92358205, 0.70999708, -1.6226576, -2.09211087,
-3.0610353 , -4.01132904, -1.9350414 , -3.52826351, 1.91080476,
1.62610419, -1.76745483, -3.14888005, -2.23737557, -2.44301187,
1.86266821, -2.42396076, -3.60575233, 1.90270001, 1.04609838,
-2.00217187, -2.96694612, 0.80161057, -3.85672376, -1.76613068,
-1.89509288, -1.75688135, -0.98477311, 1.5547436, -2.48632344,
-2.37946936, -1.78965801, -2.22697128, -2.06596927, -4.22821595,
-3.25585785, -2.57064446, -2.96608956, 2.35137257, -3.524088 ,
2.93260012, -1.62467665, -1.76526123, 0.3526922, 1.84627986,
-1.64703295, -1.621981 , -3.13803752, -2.68168638, 0.80769069,
-2.20464655, 0.10192214, -2.71833182, -2.33151929, -2.43351201,
-2.22072064, -1.97859419, 0.38168896, -2.59570272, -1.90540134,
0.68648845, 1.41114356, -3.18095304, -1.52107634, -2.65747456,
1.43275118, -2.87973969, -2.91366372, 0.10754748, -3.04329901,
0.54743601, 1.94844411, -3.23320617, -2.00331774, -3.15661575,
-2.91060657, -0.82891214, -2.85569571, 1.5317616, 1.32000942,
-3.159536 , -2.04165317, 0.69468064, -2.64763239, -2.92196946])
```

8F: Implementing Platt Scaling to find P(Y==1|X)

### 0.2 TASK F

```
[13]: n_plus=np.count_nonzero(y_train==0)
n_minus=np.count_nonzero(y_train==1)

y_plus=(n_plus+1)/(n_plus+2)
y_minus=1/(n_minus+2)
```

```
[14]: print(y_plus)
print(y_minus)
```

- 0.9995224450811844
- 0.001098901098901099

```
[15]: y_cv_m=[]
for value in y_cv:
    if value==1:
        y_cv_m.append(y_plus)
    else:
        y_cv_m.append(y_minus)
```

Applying SGD algorithm with  $(f_{cv}, y_{cv})$ 

### 0.2.1 Logistic Regression with SGD and L2 regularization

```
[16]: w = np.zeros_like(fcv[0])
b = 0
eta0 = 0.0001  #learning rating for updation of weight (alpha)
alpha = 0.0001  #lambda=alpha
N = len(fcv)
```

```
[17]: def sigmoid(w,x,b):
    z=np.dot(x,w)+b
    den=1+np.exp(-z)
    return 1/den
```

```
[18]: def logloss(w,b,X,Y):
    leng=len(X)
    loss=0
    for i in range(leng):
        sigma=sigmoid(w,X[i],b)
        loss+=-Y[i]*math.log(sigma)-(1-Y[i])*math.log(1-sigma)
    return loss/leng
```

```
[19]: currloss_cv=logloss(w,b,fcv,y_cv_m)

lr=eta0 #learning rate
lam=alpha #lambda
epoch=1000 #no of iterations

index=np.arange(N)
np.random.shuffle(index) #shuffling indices of CV data
for i in range(1,epoch): #for every epoch
    for j in index:
        X_r=fcv[j] #fcv obtained from decision function
        Y_r=y_cv_m[j] #modified y_CV

gradient=(X_r*(sigmoid(w,X_r,b)-Y_r))+((lam*w)/N) #gradient of loss w.r.
→ t w
gradient_intercept=(sigmoid(w,X_r,b)-Y_r) #gradient of intercept w.r.t⊔
→ b
```

```
coeff=w-lr*gradient #updating weight vector (wt1=wt-lr*gradient)
              intercept=b-lr*gradient_intercept #updating intecept_
       \hookrightarrow (bt1=bt=lr*gradientintercept)
              w=coeff #storing wt=wt1 for next iteration
              b=intercept #storing bt=bt1 for next iteration
          prevloss_cv=currloss_cv
          currloss_cv=logloss(coeff,intercept,fcv,y_cv_m) #loq loss for fcv with_
       →updated weight vector and intercept
          if round(currloss_cv,4) == round(prevloss_cv,4): #comparing previousloss and_
       \rightarrow currentloss
              epoch_value=i
              print("training stoped at epoch value {}".format(epoch_value))
              break
      print("weight vector")
      print(w) #final weight vector
      print("intercept")
      print(b) #final intercept
     training stoped at epoch value 124
     weight vector
     1.5803390920347105
     intercept
     -0.026179045106336885
     P(Y=1|X) For X_{test}
[20]: proba=[]
      for i in range(len(ftest)):
          z=(w*ftest[i])+b
          den=1+np.exp(-z)
          proba.append(1/den)
[21]: print(proba)
     [0.0048995904697188555, 0.8806465971156808, 0.08741397618987096,
     0.9412614791333794, 0.06586381732554393, 0.013655284673623806,
     0.009217205644841594, 0.07355535707771071, 0.9568919347498185,
     0.18232602180436344, 0.0027895428876515433, 0.36850822618555856,
     0.010452434931047421, 0.044340483190568734, 0.9257750372678927,
     0.021516539677898353, 0.007555896295353715, 0.054875537312578174,
     0.00738766447828194, 0.21741443685541295, 0.7002454137494336,
```

```
0.8905071807425987, 0.9583862056580215, 0.062008826658403224,
0.4556315505336035, 0.004082602220416073, 0.07688743360769966,
0.9756176989175662, 0.004184649129323063, 0.0055776703200314135,
0.0387106472563608, 0.0646570140496937, 0.006462121856114173,
0.008745639342890577, 0.010692098750587868, 0.030077424843471947,
0.021790267379330115, 0.0006439848285347789, 0.8279149507106784,
0.03618336669475702, 0.011970505215466942, 0.043458213500713314,
0.013647928889025798, 0.9911077233950296, 0.05890911248958363,
0.6725132990054726, 0.8947810271096355, 0.0008864240067304752,
0.011606092835703815, 0.011746018462178971, 0.002841477444741252,
0.01574856883525259, 0.8532126850355465, 0.0021550817337043573,
0.5275588457645594, 0.01886434603809746, 0.9836924026032988, 0.6859432930296692,
0.1537896073278147, 0.0767476271060153, 0.02953991639882275,
0.16273733132544776, 0.9401094458385403, 0.011037590850097133,
0.01845883151703561, 0.0049624906378760375, 0.904990811105596,
0.5873913329000169, 0.010426395209617616, 0.8884802886738451,
0.06230448188152904, 0.014838576861303287, 0.011771207261208333,
0.04404042215979783, 0.542318338391629, 0.02749561359394093,
0.013516746974907142, 0.07755159660631289, 0.013543191361809202,
0.06662244869985952, 0.012031192121695356, 0.001790851964643971,
0.007058313062042871, 0.6971238959922588, 0.006812017066404999,
0.9585958421402333, 0.007096341155100204, 0.09009966003991551,
0.3968412184142448, 0.0017493859230746935, 0.0385342726180916,
0.02364244999712308, 0.06996346784378196, 0.004311169421735039,
0.014423826566941782, 0.030796635440739118, 0.2636607413012133,
0.0005256205675928208, 0.025927906926118398, 0.003095783605514771,
0.04477577992003017, 0.0031831728372025006, 0.9975755468065209,
0.9462304877592865, 0.870133040330059, 0.18791631051702487,
0.03939495077041025, 0.0016765935603733197, 0.8954404388856646,
0.05475098066468347, 0.011906001206468338, 0.939883359982338,
0.015616049028094417, 0.06065004665301147, 0.010047067013187153,
0.006840926788687482, 0.017800914637499422, 0.5184108806542211,
0.9157396532613017, 0.6372176227265577, 0.8950798119636003, 0.6113535693392329,
0.004973471865746804, 0.18130582639559775, 0.9613163383290314,
0.1522043802931152, 0.8656665819355466, 0.1585222635107436, 0.05371776754650506,
0.011969865922361482, 0.017216890498952094, 0.025937274086187807,
0.9806433765760735, 0.2560246356870031, 0.9423343242003199, 0.2779585240648531,
0.0151867707413084, 0.0011832724361605438, 0.10752431242868782,
0.033429220721074564, 0.8560503884564141, 0.005218572880777038,
0.9918746935739007, 0.004987134043828613, 0.021635807530235782,
0.031655872669389455, 0.01892541944358715, 0.020109526215295322,
0.1812849211429742, 0.004439902151042943, 0.008034143700122719,
0.0035703907763659625, 0.9520852670590705, 0.7154212784564787,
0.6642623817789232, 0.025241143652188915, 0.008415831572660763,
0.012422805514991087, 0.002617638996923931, 0.0034478498056824797,
0.015024592414211857, 0.031123738907695583, 0.0029318963701651843,
0.024031291493807456, 0.6189132418913672, 0.059860851253972454,
0.01739294388170042, 0.03962195833288335, 0.002886504106976684,
```

```
0.004731361715823481, 0.9437420103477807, 0.7419409188417659,
0.09200913672887713, 0.02513070251535617, 0.9746002345160392,
0.016382551176769348, 0.005621638530704305, 0.9507047081458089,
0.006065813718586505, 0.5334631653493688, 0.010280199334889547,
0.10927764769617143, 0.013480701560935194, 0.6093838803452711,
0.007462693034360131, 0.000649466076491842, 0.012595073427098672,
0.11690603807331582, 0.48314864257088863, 0.018595738022933683,
0.0018814759141359647, 0.2051473923881492, 0.08379600304884,
0.05721572635714983, 0.9372144503641014, 0.03719806206878882,
0.056959944347158474, 0.01543659827595621, 0.0026081862733391284,
0.0032943273574804624, 0.7615595018110677, 0.023313609270052833,
0.10247676020292298, 0.006685336012384774, 0.8514356257763002,
0.0012771009337243433, 0.9547716945892163, 0.00915659172926913,
0.02254197038752793, 0.033428977235227864, 0.017419312221541302,
0.013703657041016126, 0.016527029120493017, 0.012903020236799874,
0.001897523071830179, 0.0022395367198608735, 0.5880558550053053,
0.0015857791044729102, 0.09355954145972863, 0.0013911447577726254,
0.963234114796972, 0.03339157712276841, 0.9524712635368425, 0.03660491234398485,
0.003822320665832174, 0.0005820265895392945, 0.005502433450061532,
0.0186505606007711, 0.004524957835336543, 0.005236772796555555,
0.9008707769236177, 0.09856251366163722, 0.01062395083556692,
0.00706693964450704, 0.026553789128808528, 0.0069481298322912645,
0.003999711431007553, 0.0813438890189293, 0.938621503325395,
0.09679353786604201, 0.009723551400676567, 0.011501198836229064,
0.9313175661868064, 0.9540770207028837, 0.03126930317921253, 0.9666393933059791,
0.021047277167763934, 0.9724294089271575, 0.014168315012152983,
0.4339578236357411, 0.006839197863687817, 0.4072143063015633,
0.01308438779009412, 0.016194172883378072, 0.14350207625767042,
0.9497677459308134, 0.12520847619506767, 0.06147535140135759,
0.9267824419043068, 0.05506460149274651, 0.293074221619979, 0.03419318550969087,
0.9329059044371901, 0.8873434741595351, 0.5240467224444747, 0.973976867834669,
0.013098755674027338, 0.9083634668684126, 0.023135577021250017,
0.016880936474489943, 0.017260086046432446, 0.05348330215000101,
0.07646598369349451, 0.004612577138144479, 0.06076372969431029,
0.007584179106032576, 0.8702329842351475, 0.920281343174408, 0.4115969033924264,
0.6552478872669114, 0.002426561368196927, 0.015855837001624146,
0.035126645451801, 0.003861774906023119, 0.8844067125981077,
0.0034428973756787753, 0.8793025564132587, 0.023433911745203064,
0.03466362621006066, 0.0024238512391008635, 0.6610651299706976,
0.006978695057547559, 0.013050390752614728, 0.7457675708084092,
0.8403498768783764, 0.0022043663764995374, 0.002270552719994197,
0.9459310541896838, 0.017066978679610368, 0.8756268972662663,
0.40757223961205835, 0.025592205580706903, 0.004833520469784172,
0.588988365405682, 0.01881682748862549, 0.9351547716420817,
0.009558106045179334, 0.049501513957360764, 0.06729692399895754,
0.06808202358804501, 0.9360734068465679, 0.07154260601841977,
0.0037673964314386883, 0.014338482685561161, 0.036171556676680316,
0.9366566339373943, 0.1478840725223728, 0.01931360284560816,
```

```
0.0038185470560077183, 0.9301980004785654, 0.0571436197194983,
0.30656131470791526, 0.6632122237548312, 0.007155197144321103,
0.07088345226110106, 0.028817102839097226, 0.012920841868486107,
0.26850986557638523, 0.07389269554164818, 0.3519564240634074,
0.13849874149912755, 0.9415363323494527, 0.048726414358546064,
0.5477481195059889, 0.003353629525192655, 0.023786000874611114,
0.024213837724176897, 0.05291808078034099, 0.8251242768386251,
0.015872452332840126, 0.06891502271485195, 0.7464490512256361,
0.047337360667508675, 0.9432979153949799, 0.0013534556306828323,
0.10204714514558469, 0.25250399423348435, 0.0071604117432597,
0.23102595883789057, 0.5005558571657038, 0.8843700228003915, 0.9777999172145969,
0.5486123796967585, 0.0013721437243787024, 0.0006659416156099391,
0.006174063933447443, 0.010884140971805447, 0.09036600264623687,
0.016579574501736614, 0.04019549943901587, 0.003565578801327208,
0.00419330420933257, 0.01411660374154292, 0.008811689518900944,
0.009680371552744085, 0.25108750223147136, 0.7064823302245814,
0.007036683980509769, 0.0011572593618598887, 0.3513752470359871,
0.21692442669781836, 0.009700862010464804, 0.02312528159050359,
0.006080605017313378, 3.0274210656006428e-05, 0.08815816102515626,
0.7480448938334443, 0.009989826000776206, 0.09825734898235326,
0.39646141581321404, 0.9711574965705183, 0.013152690704634285,
0.9080233776639449, 0.09394739949405204, 0.9701648595013724,
0.0050130283754195905, 0.0011027930210509842, 0.004709612096721076,
0.9428769412424803, 0.02627672909420666, 0.0021225595385165772,
0.01617427806231928, 0.06072663991622767, 0.10941800210353413,
0.06346823668618774, 0.027677416617188578, 0.0288812244367621,
0.12119823682580878, 0.09570473837293043, 0.3476618100192249,
0.015103669356583648, 0.007768359327195142, 0.8332517670369607,
0.6124285497934306, 0.5283148819045625, 0.027560432515944255,
0.7279053915247342, 0.022886732121670472, 0.8693044038457645,
0.00047679718456332203, 0.40704406329095694, 0.27067227683818956,
0.013138384949204607, 0.027348093284701152, 0.9403692303184545,
0.056527617239893184, 0.026023024707456436, 0.944585730507131,
0.0020306167424671067, 0.37803097377034783, 0.7952704207146946,
0.0021911981097872523, 0.012948881093609251, 0.02427441268498218,
0.8997082354713386, 0.5743724321044207, 0.9401507281088773,
0.025105066743958952, 0.009079246709848141, 0.005933406199724881,
0.398925648384078, 0.11602525269518608, 0.9459731964390647,
0.025283937686411607, 0.06864455513494187, 0.8863525349112463,
0.009813074170243461, 0.08636356122285573, 0.9227640333530538,
0.013709883442445796, 0.002402795885465368, 0.015020791076960993,
0.22896140309514135, 0.004301161882843182, 0.06270168184693112,
0.8632196550169493, 0.026255585078482697, 0.05737226926910544,
0.12257334182665804, 0.023648337063570155, 0.02105470231680559,
0.017106321138958092, 0.7150612313737541, 0.07304284376510319,
0.022628852683159034, 0.06522262828717551, 0.0016107535119037498,
0.10187399029903484, 0.007585773098610746, 0.7369123253456836,
0.9024386755787506, 0.03627694147340199, 0.029962785769776505,
```

```
0.9492372632416859, 0.00604427948661641, 0.010993075738296184,
0.0018739358288904035, 0.943664938173628, 0.2649865207113848,
0.009731318571413293, 0.00030090542356657897, 0.02157736630067225,
0.07283717657398775, 0.9381076510157071, 0.00179731841976474,
0.8439092269277457, 0.031103017974521797, 0.01196396532290685,
0.1069061360666396, 0.9146366773890776, 0.023663777494545016,
0.0062404131099294494, 0.9721280047810273, 0.11126606544575016,
0.7326732274559603, 0.9071052535778223, 0.9234847628934181, 0.7445559997868555,
0.04352317904976984, 0.04737549680057148, 0.02699774062547416,
0.07192410149702176, 0.020178229084315564, 0.005026532186659513,
0.03797402874407617, 0.19801884411555823, 0.0025485192066794222,
0.009008766307732034, 0.003776625154249322, 0.8951646933361481,
0.06115967994181222, 0.9836235485149287, 0.9973348301532257,
0.012803923883206673, 0.05227546922654409, 0.001831501795691665,
0.7402994108683356, 0.006614140151984222, 0.06210068572588031,
0.01875443161320674, 0.9507047572183904, 0.023099671593343717,
0.09765220495139464, 0.02255237562740419, 0.8576785101024713,
0.042251413589471785, 0.001908472280175284, 0.05961870089636536,
0.18637740814912887, 0.30398418285903805, 0.916996703389233,
0.15893861520800365, 0.007691017382615903, 0.00701049990675576,
0.01198618256939196, 0.9888474956974065, 0.05700899266325589,
0.9353785214234661, 0.03385485101663693, 0.006751783538353694,
0.11399292215739934, 0.025065744948167677, 0.010731041316060662,
0.043948482083644075, 0.9455395635325601, 0.982513076327561,
0.12259355760686744, 0.04130054495547456, 0.4625648797493511,
0.9651266015361781, 0.013058962306803092, 0.011495665402584876,
0.05691273231585632, 0.0614712505737573, 0.9377169930056722, 0.9164221885201937,
0.25545265542410345, 0.056933081855511596, 0.3950389523557515,
0.9106140542899966, 0.03699195569132985, 0.10477790844038326,
0.9640577218314643, 0.3090735912777414, 0.8754692583396818, 0.13406889415854792,
0.18878713875442674, 0.07749875955477442, 0.9384946616292893,
0.003941757290682457, 0.2311885729083904, 0.08932938029467152,
0.5935318121049394, 0.0233952886734267, 0.8874332973531579,
0.0014662303450318143, 0.8721392900047023, 0.001651826885413364,
0.0018642976924103493, 0.03298235128827489, 0.9118597861969582,
0.9547338093248414, 0.14837863113730024, 0.010959210304988538,
0.006136351871628755, 0.9547576800855081, 0.9089837583369397,
0.9164853632245847, 0.0018434542095949256, 0.996523819281265,
0.8826142078957941, 0.004264524668581153, 0.016173966323458796,
0.02192641239053054, 0.954901755950302, 0.85507042093846, 0.32553557028431523,
0.01880854744192833, 0.026036644713685622, 0.6702422319760973,
0.027396338068445124, 0.012580455850126739, 0.01383938793204081,
0.11536481931907563, 0.026356714039006822, 0.7657551503528667,
0.936819167594977, 0.005399916759974296, 0.02592091666942514,
0.004271394339984272, 0.015916002183821984, 0.6787365812298762,
0.014678351060451887, 0.027633510947977415, 0.007048423849024854,
0.00240253595740198, 0.9474424365850153, 0.03748636054262278,
0.0022160977724833774, 0.019033335546510755, 0.9927958027889623,
```

```
0.1509754378764053, 0.6487181627107876, 0.020549421478255562,
0.9601664451189549, 0.5740326161960296, 0.005290525791043957,
0.009034006220140535, 0.0398938506040463, 0.002885299640128614,
0.008138626297639263, 0.008465418701725224, 0.10827861148403888,
0.9476270487734891, 0.8951693378811446, 0.010271617611598713,
0.03349925929238446, 0.043619434058524795, 0.023963190119511993,
0.20265370432874927, 0.003398726448584112, 0.030241546807552405,
0.021714384172592402, 0.9568987174334322, 0.9548585559823902,
0.9164723529951532, 0.9065354949671683, 0.9799679826428352, 0.8663860699519956,
0.9325720041686364, 0.012258053588891387, 0.044710784191293804,
0.7823558034418486, 0.001830379461250499, 0.011900619777366055,
0.777097285364561, 0.022462514334824414, 0.0611131549375286,
0.17381265573258006, 0.684670687146999, 0.2191996881263063, 0.262454643455256,
0.91047496633689, 0.008436509016592248, 0.8988119400559742, 0.0993566843129708,
0.0016106283814476747, 0.013895963152859165, 0.004254196315466997,
0.9193972698214964, 0.9240659993094235, 0.06433258340132139, 0.5391730133895215,
0.7684516869056289, 0.021432946608572187, 0.011085999739203047,
0.09386383035858288, 0.8594484406420114, 0.007567288875246382,
0.06625251867059447, 0.0022626407657212, 0.024264698603134533,
0.08522024002289294, 0.10978654656257052, 0.9378044711588279,
0.00501529508745414, 0.2761517928272679, 0.2226772384304624, 0.9386692104625858,
0.014978272932089372, 0.014369338512872334, 0.9576817084548853,
0.6065097170782705, 0.9620833209455002, 0.002560028839976917,
0.9195892238804929, 0.3542898768624546, 0.004082503176640464, 0.073280688316444,
0.08215473119318879, 0.1703418160301726, 0.9253835414707325,
0.12248778543229988, 0.8509231696316294, 0.6927828134775594,
0.03682070344480737, 0.3838838216684543, 0.3569257004038864,
0.012141473600718697, 0.9251000264244157, 0.06432475903534657,
0.013166684016470889, 0.1750944348576984, 0.010150346744298712,
0.012021952673831665, 0.023658239114139983, 0.01617739668760919,
0.001646335104622499, 0.14157366359473947, 0.17228909618878283,
0.025554593518855282,\ 0.09011872663554404,\ 0.06507894258581563,
0.24369180946222715, 0.013778583773183663, 0.9703793167047363,
0.0038790618334634936, 0.004806773555435849, 0.4065157763377883,
0.006969532773092035, 0.020200916787198146, 0.006355643221314131,
0.017954900037729135, 0.9454360333615939, 0.8938408881213068,
0.0046172385503891016, 0.08254863638685901, 0.012505551128226225,
0.5950273165828637, 0.8797781816070256, 0.007829268754706893,
0.05237038220616057, 0.01134703875190678, 0.9064541013265648,
0.005892258125632147, 0.011823123517586803, 0.5147155709854856,
0.9764335746558384, 0.9173887661438163, 0.0016321326269082923,
0.0175681510429258, 0.006921462736057277, 0.006768865846591144,
0.9290282443550418, 0.9739352439233092, 0.14553822870599487,
0.014042723053410049, 0.16627508525647955, 0.026834692382106378,
0.001231071645147674, 0.8926548989870373, 0.028814678852261983,
0.00021945796698530262, 0.0024978135486524193, 0.02035865261128825,
0.011020380095545386, 0.29981916123147256, 0.03877730445209044,
0.9307216154941137, 0.025588959849473784, 0.04853919834532217,
```

```
0.15828913361017005, 0.3073839485313683, 0.006859392797403959,
0.6966531189438091, 0.013171835862721054, 0.030583843743613566,
0.9467784251381438, 0.7734243309811893, 0.5692364099022562, 0.6943542845452917,
0.06045403732830041, 0.049423390298050006, 0.0032917258384857727,
0.08299813179505508, 0.9026288763005836, 0.008910195519219136,
0.02920689618949682, 0.9619252053702653, 0.36067895426526364,
0.02613639644255914, 0.002982554579865632, 0.8878181004339032,
0.9304080797906636, 0.008848877916993675, 0.9745217048183068,
0.8360763733889347, 0.027120678919524754, 0.013252954268204253,
0.9172480147855903, 0.7119602050207571, 0.0027992029694472167,
0.028472147565282498, 0.9964194481313641, 0.040028137246573385,
0.07746056568690111, 0.014209550225899495, 0.011517710890487736,
0.9464731566384421, 0.010249657972137428, 0.9269690714212452,
0.007921202033849689, 0.06022353819797588, 0.9480199127580998,
0.33465870356666977, 0.9468127751814048, 0.002528569420167329,
0.00904403668279548, 0.6241200354495716, 0.10977755325768196,
0.02254205582284861, 0.8934334213069043, 0.07661975948881901,
0.007876056381170496, 0.9446824492554396, 0.7156059963557305,
0.0015244975973740592, 0.013271114689966343, 0.00673380261243466,
0.7982387129476026, 0.9030303333774421, 0.0076669551172982055,
0.0009240570639325975, 0.20587969961222372, 0.6024544535278603,
0.2453441275047385, 0.24995316736175505, 0.8339454608248857, 0.2953264828859993,
0.7689379979395001, 0.0007179096555511092, 0.037556937110652944,
0.1990937531959149, 0.29969457697665136, 0.00980895890993567,
0.0001670950570677259, 0.01924351770634796, 0.08088340724776566,
0.018919243519208064, 0.5552299439994036, 0.9271775826789531,
0.4442387462559186, 0.03325164495779037, 0.09329402169268139,
0.0073442058210046405, 0.5592895731565156, 0.9130280645390514,
0.9386661090455615, 0.3978035771104196, 0.9762977296882415, 0.00953251626368295,
0.9229403862844633, 0.3833415882729909, 0.9456438310202648, 0.9962894684830828,
0.9767518422102758, 0.024930468078810285, 0.6935097091216911,
0.8050295487659452, 0.9240469308168608, 0.002277816939839186,
0.5419786026056278, 0.9558845340695572, 0.8119698921133528,
0.0053284772788065645, 0.9122883750490564, 0.00046997556794232156,
0.010389261788481966, 0.9185206044058785, 0.9130895543079929,
0.06096428154523672, 0.04814836039747949, 0.009369133462225926,
0.9889700638745739, 0.977493175528356, 0.3542807203956563, 0.009053066077434028,
0.009085308413352105, 0.0029461212162805324, 0.961518895596872,
0.011645725773722866, 0.000730121697300609, 0.8828220338780283,
0.022741636205912765, 0.9932880706906354, 0.005788687905193728,
0.0014309299299457292, 0.2174488716360325, 0.008361315397452577,
0.7291392572920137, 0.008856202521677787, 0.009105160243786953,
0.0064497713126398905, 0.001699428955803242, 0.0068736338144209305,
0.000905534618535167, 0.907385348507572, 0.1310714230716135,
0.03870247745777952, 0.9200500708888, 0.2523138617552164, 0.003321183667416323,
0.0074882047159692275, 0.005679672024934652, 0.8273016858943437,
0.0029545365074826043, 0.9503345207711769, 0.05738200858556226,
0.01471692927121954, 0.002649244037035902, 0.0019859717334986316,
```

```
0.9742952928260786, 0.96718223576562, 0.04517460884945363, 0.7758167601313175,
0.0006813681653582728, 0.9531906900980965, 0.7494830451729709,
0.0697504975500954, 0.03447546402864579, 0.007663048862421147,
0.001717032714549475, 0.043763688749837666, 0.00367678939169948,
0.9522814497111184, 0.9271435254939255, 0.0562870790953482,
0.006676401881345044, 0.027598935860182982, 0.02009536216030939,
0.9487032348094147, 0.02069686503180862, 0.0032543910315557013,
0.951696040138763, 0.835759780025343, 0.03953278475420589, 0.008880652028926957,
0.7756749556919136, 0.0021912043088927243, 0.05639833919033119,
0.04648309740558826, 0.057181287436969264, 0.17044814680483508,
0.919149204931616, 0.018790894544782406, 0.022171047558194813,
0.054451975319186684, 0.028043645961673743, 0.03587739466277712,
0.0012193783138792244, 0.005643796739959648, 0.0164852112920597,
0.008892574504386923, 0.9756313409217138, 0.0037010415813556255,
0.9901298745682929, 0.0695437456054973, 0.05647150565972589, 0.62976160492512,
0.9474280950843394, 0.06729207669929008, 0.06981990785658462,
0.006791003362855656, 0.01386872936158476, 0.7773424648654439,
0.029021477930160414, 0.5336720820181278, 0.013098596035919188,
0.023874735396028277, 0.02039313111442412, 0.028314155257546533,
0.04097210109858152, 0.6403811760016039, 0.01585529347036354,
0.04576635771915757, 0.7424430856051096, 0.9005997492483502,
0.006348528332826376, 0.08091380632444521, 0.014401879321382375,
0.9036150741094201, 0.010179534867641105, 0.009653295574367721,
0.5358838114227735, 0.007879161320684504, 0.6982451833322124,
0.9549128739982046, 0.005848286283071595, 0.03946408424116785,
0.006595814610619035, 0.009699593289069431, 0.20814533499109067,
```

0.010569608925428341, 0.9164087534155079, 0.8869424830226923, 0.006565644599817379, 0.037230584407830974, 0.7449109407741359,

0.01462433538918127, 0.009528614898460594]

[]: