2. 1 1. c 2.2 1. a [[1]] $\hbox{\tt [1] 0.10080922 0.10026060 0.08942532 0.09107118 0.07433823}$ 2. a [1] 0.01001234 0.09024825 0.07625840 0.08846523 0.08832808 3. b 1697-363 (0 Vs all: 1697, 1 Vs all: 363) 4. a,c (c is also right if this option does not mean only max c take lowest Etrain) # of support vectors: 494, 166, 59, 2 Etest: [1] 0.05896226 0.01886792 0.01886792 0.02122642 Etrain: [1] 0.032030750 0.006406150 0.003203075 0.003203075 there are two choices of c which can get lowest Etrain, not at max c only. 5. b Q=2 Etrain:[1] 0.201153107 0.032030750 0.006406150 0.003203075 Q=5 Etrain: [1] 0.024343370 0.005124920 0.003203075 0.002562460 Q=2: #of support vectors: 1080,494,166,29

Q=5: #of support vectors: 221,92,38,22

Q=2: Etest: [1] 0.19811321 0.05896226 0.01886792 0.02122642 Q=5: Etest: [1] 0.03773585 0.01886792 0.02358491 0.02594340

2.3

1.d

2.a

- best parameters:

cost

0.1

- best performance: 0.003196962

- Detailed performance results:

cost error dispersion

1 1e-04 0.216519680 0.029963208

2 1e-03 0.036518047 0.013197018

3 1e-02 0.006402090 0.006034072

4 1e-01 0.003196962 0.004513521

5 1e+00 0.003196962 0.004513521

both c=0.1 and c=1 get the lowest error, so we take the smaller c here.

2.4

1.e

Etrain: [1] 0.005765535 0.003203075 0.002562460 0.001281230 0.000000000

2.a,b,c

Etest: [1] 0.01886792 0.01886792 0.01886792 0.02594340 0.02358491

big c tends to give a more unstable model fit

```
> choi ce1=c(0, 2, 4, 6, 8)
> trainError(choi ce1)
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification",
kernel = "pol ynomi al ",
    gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
   SVM-Type:
               C-classification
 SVM-Kernel:
               pol ynomi al
               0.01
       cost:
     degree:
      gamma:
               1
     coef. 0:
               1
Number of Support Vectors:
                              1697
 (849 848)
Number of Classes:
Level s:
 - 1 1
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification",
kernel = "polynomial",
    gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
   SVM-Type:
              C-classification
 SVM-Kernel:
               pol ynomi al
               0.01
       cost:
     degree:
               2
      gamma:
               1
     coef. 0:
               1
Number of Support Vectors:
                            1479
 ( 748 731 )
Number of Classes: 2
Level s:
 - 1 1
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification",
kernel = "polynomial",
    gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
```

Parameters:

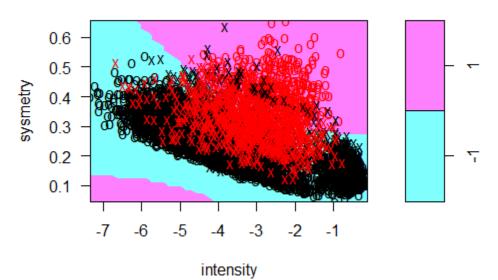
```
C-classification
   SVM-Type:
 SVM-Kernel:
               pol ynomi al
       cost:
               0. 01
     degree:
              2
      gamma:
               1
     coef. 0:
Number of Support Vectors: 1324
 (672652)
Number of Classes: 2
Level s:
 - 1 1
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification",
kernel = "polynomial",
    gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
   SVM-Type:
              C-classification
 SVM-Kernel:
              pol ynomi al
       cost:
               0. 01
     degree:
              2
      gamma:
               1
     coef. 0:
Number of Support Vectors:
                              1336
 (664672)
Number of Classes:
                     2
Level s:
 - 1 1
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification",
kernel = "polynomial",
    gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
   SVM-Type:
              C-classification
 SVM-Kernel:
              pol ynomi al
       cost:
              0. 01
     degree:
               2
               1
      gamma:
     coef. 0:
              1
Number of Support Vectors:
                              1104
 (562542)
```

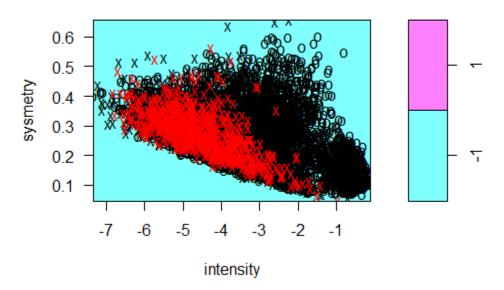
Number of Classes:

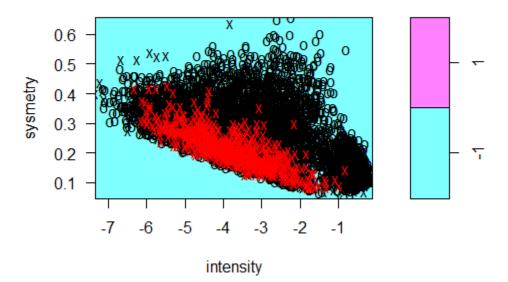
Levels:

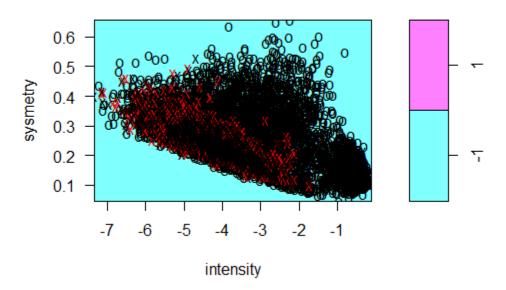
[[1]]
[1] 0. 10080922 0. 10026060 0. 08942532 0. 09107118 0. 07433823
[[2]]
[1] 0. 10513204 0. 09865471 0. 09965122 0. 08470354 0. 08271051

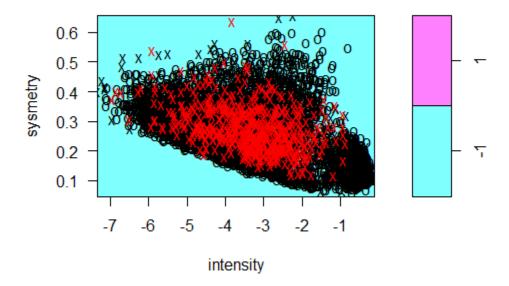
>











> choi ce2=c(1, 3, 5, 7, 9)
> trai nError(choi ce2)

```
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification", kernel = v_train[, -1], type = v
"pol ynomi al "
                       gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
                 SVM-Type:
                                                                                  C-classification
                                                                                  pol ynomi al
      SVM-Kernel:
                                         cost:
                                                                                  0.01
                                                                                  2
                              degree:
                                  gamma:
                                                                                  1
                              coef. 0:
Number of Support Vectors:
                                                                                                                                                                     363
      (181 182)
Number of Classes: 2
Level s:
      -11
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification", kernel = 1]
 "pol ynomi al "
                       gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
                  SVM-Type:
                                                                                  C-classification
      SVM-Kernel:
                                                                                  pol ynomi al
                                         cost:
                                                                                  0.01
                                                                                  2
                              degree:
                                   gamma:
                                                                                   1
                              coef. 0:
                                                                                  1
Number of Support Vectors:
                                                                                                                                                                    1331
      (673658)
Number of Classes: 2
Level s:
     - 1 1
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification", kernel = 1 type = 1 type
                       gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
                 SVM-Type:
                                                                                  C-classification
      SVM-Kernel:
                                                                                  pol ynomi al
```

```
cost:
                                                                                            0.01
                                  degree:
                                                                                              2
                                                                                              1
                                        gamma:
                                  coef. 0:
                                                                                             1
Number of Support Vectors: 1129
       (573 556)
Number of Classes: 2
Level s:
     - 1 1
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification", kernel = v_train[, -1], type = v
  "polynomial"
                          gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
                    SVM-Type:
                                                                                            C-classification
       SVM-Kernel:
                                                                                             pol ynomi al
                                              cost:
                                                                                              0. 01
                                  degree:
                                       gamma:
                                                                                              1
                                  coef. 0:
                                                                                              1
Number of Support Vectors:
                                                                                                                                                                                           1333
       (688 645)
Number of Classes:
Level s:
      - 1 1
Call:
svm(formula = y_train \sim ., data = x_train[, -1], type = "C-classification", kernel = 1.5 cm | 1.5 cm
                          gamma = 1, coef0 = 1, degree = 2, cost = 0.01)
Parameters:
                                                                                             C-classification
                    SVM-Type:
       SVM-Kernel:
                                                                                              pol ynomi al
                                                                                              0.01
                                               cost:
                                  degree:
                                                                                              2
                                        gamma:
                                                                                               1
                                  coef. 0:
Number of Support Vectors:
                                                                                                                                                                                           1316
       (672644)
```

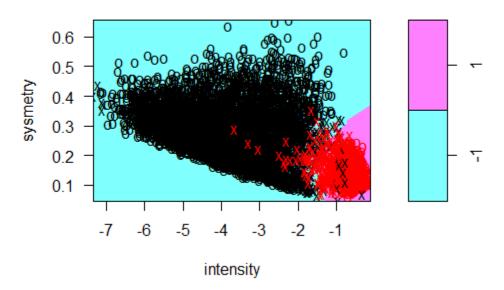
```
Number of Classes: 2

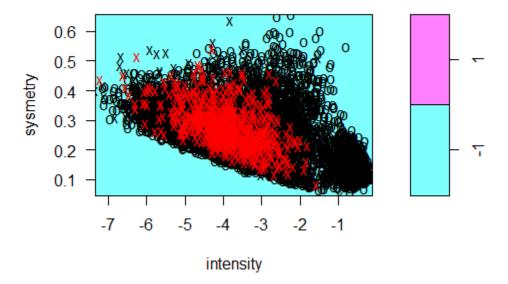
Levels:
-1 1

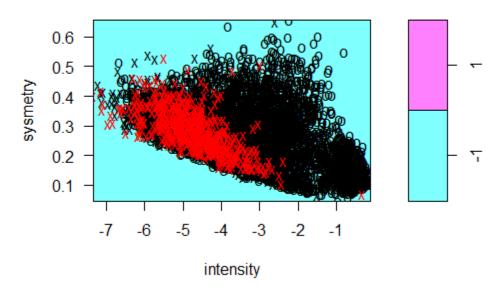
[[1]]
[1] 0.01001234 0.09024825 0.07625840 0.08846523 0.08832808

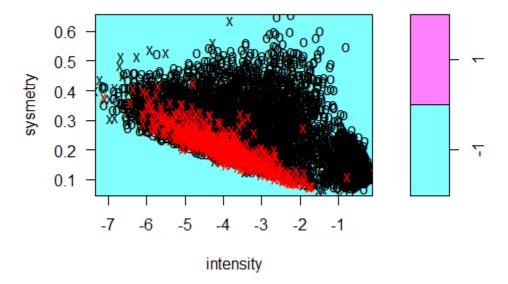
[[2]]
[1] 0.01943199 0.08271051 0.07972098 0.07324365 0.08819133
```

>









```
0.6 - 0.5 - 0.4 - 0.3 - 0.2 - 0.1 - 7 - 6 - 5 - 4 - 3 - 2 - 1 intensity
```

```
> choi ce3=c(0.001, 0.01, 0.1, 1)
> Error(choi ce3)
Call:
Parameters:
  SVM-Type:
            C-classification
SVM-Kernel:
            pol ynomi al
            0.001
      cost:
    degree:
            2
    gamma:
coef. 0:
            1
Number of Support Vectors:
                        494
(247247)
Number of Classes: 2
Level s:
- 1 1
Call:
svm(formula = y_train \sim ., data = x_train_1[, -1], type = "C-classification",
```

```
kernel = "polynomial", gamma = 1, coef0 = 1, degree = 2, cost = e)
Parameters:
  SVM-Type:
           C-classification
           pol ynomi al
SVM-Kernel:
           0. 01
     cost:
    degree:
           2
    gamma:
           1
    coef. 0:
Number of Support Vectors:
                      166
(83 83)
Number of Classes:
                2
Level s:
-11
Parameters:
  SVM-Type:
           C-classification
           pol ynomi al
SVM-Kernel:
     cost:
           0. 1
    degree:
    gamma:
           1
    coef. 0:
           1
Number of Support Vectors:
                       59
(3029)
Number of Classes:
Level s:
- 1 1
Call:
Parameters:
  SVM-Type:
           C-classification
SVM-Kernel:
           pol ynomi al
     cost:
    degree:
           2
    gamma:
           1
    coef. 0:
```

```
Number of Support Vectors: 29
  ( 14 15 )

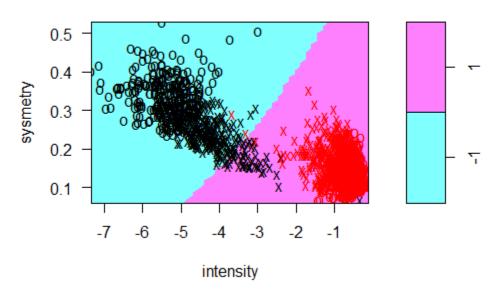
Number of Classes: 2

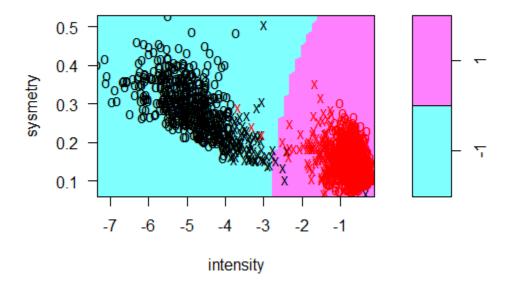
Levels: -1 1

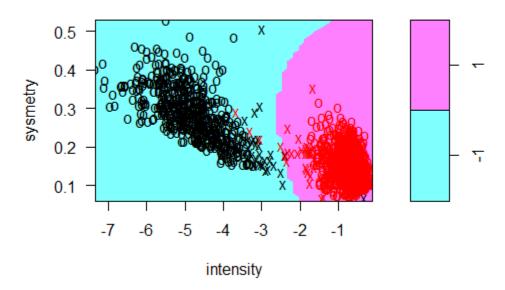
[[1]]
[1] 0. 032030750 0. 006406150 0. 003203075 0. 003203075

[[2]]
[1] 0. 05896226 0. 01886792 0. 01886792 0. 02122642
```

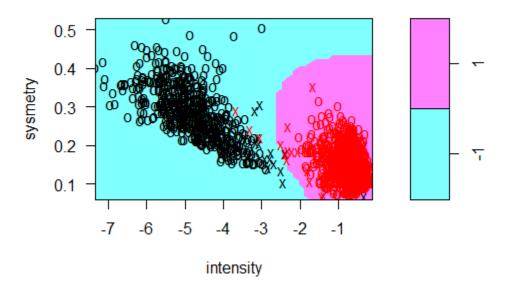
>







SVM classification plot



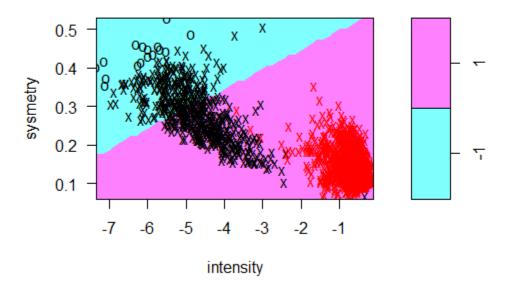
> choi ce3_1=c(0.0001, 0.001, 0.01, 1) > Error(choi ce3_1)

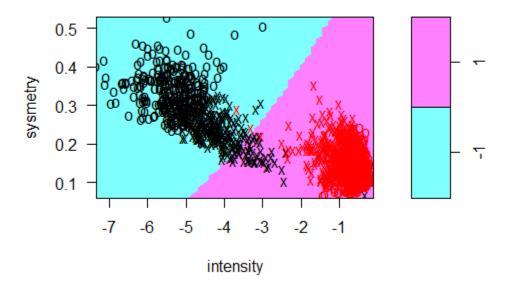
Call: $svm(formul\, a = y_trai\, n \sim ., \quad data = x_trai\, n_1[, -1], \quad type = "C-classification", \\ kernel = "polynomial", \quad gamma = 1, \quad coef0 = 1, \quad degree = 2, \quad cost = e)$

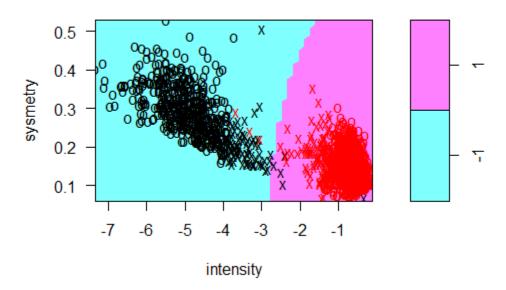
Parameters:

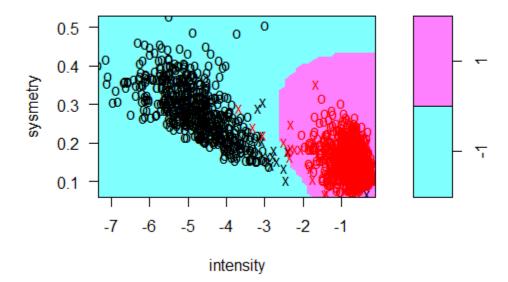
```
C-classification
  SVM-Type:
SVM-Kernel:
           pol ynomi al
           1e- 04
     cost:
    degree:
           2
    gamma:
           1
    coef. 0:
Number of Support Vectors: 1080
(540 540)
Number of Classes: 2
Level s:
- 1 1
Call:
Parameters:
  SVM-Type:
           C-classification
SVM-Kernel:
           pol ynomi al
     cost:
           0.001
    degree:
           2
           1
    gamma:
    coef. 0:
           1
Number of Support Vectors:
                      494
(247247)
Number of Classes: 2
Level s:
-11
Call:
Parameters:
  SVM-Type:
           C-classification
SVM-Kernel:
           pol ynomi al
     cost:
           0. 01
    degree:
           2
    gamma:
           1
    coef. 0:
           1
Number of Support Vectors:
                      166
(8383)
```

```
Number of Classes: 2
Level s:
 - 1 1
Call:
Parameters:
SVM-Type:
SVM-Kernel:
              C-classification
               pol ynomi al
        cost:
     degree:
                2
     gamma:
coef. 0:
               1
1
Number of Support Vectors:
                               29
 ( 14 15 )
Number of Classes: 2
Level s:
- 1 1
 \begin{array}{c} [\,[\,1\,]\,] \\ [\,1\,] \ \ 0.\ 201153107 \ \ 0.\ 032030750 \ \ 0.\ 006406150 \ \ 0.\ 003203075 \end{array} 
[[2]]
[1] 0. 19811321 0. 05896226 0. 01886792 0. 02122642
```





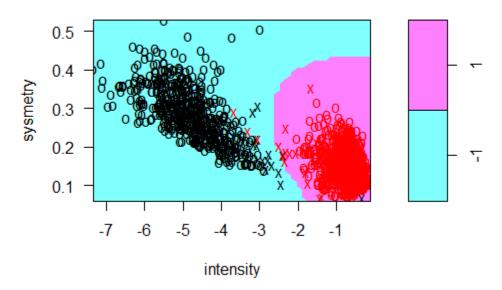


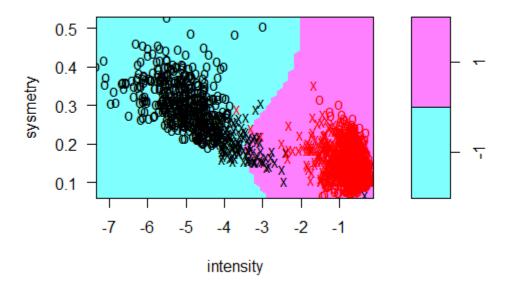


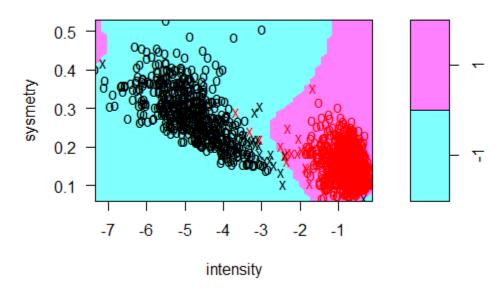
> choi ce4=c(0.001, 0.01, 0.1, 1) > Error(choi ce4)

```
Call:
svm(formula = y_train ~ ., data = x_train_1[, -1], type = "C-classification",
    kernel = "polynomial", gamma = 1, coef0 = 1, degree = 5, cost = e)
Parameters:
   SVM-Type:
                C-classification
 SVM-Kernel:
                pol ynomi al
                0.001
       cost:
     degree:
                5
                1
      gamma:
     coef. 0:
                1
Number of Support Vectors: 221
 (109 112)
Number of Classes:
Level s:
 - 1 1
Parameters:
   SVM-Type:
                C-classification
 SVM-Kernel:
                pol ynomi al
        cost:
                0.01
     degree:
                5
      gamma:
                1
     coef. 0:
                1
Number of Support Vectors:
                                92
 (4547)
Number of Classes: 2
Level s:
 -11
Call:
svm(formula = y_train ~ ., data = x_train_1[, -1], type = "C-classification",
    kernel = "polynomial", gamma = 1, coef0 = 1, degree = 5, cost = e)
Parameters:
   SVM-Type:
                C-classification
 SVM-Kernel:
                pol ynomi al
        cost:
                0. 1
     degree:
                5
      gamma:
                1
     coef. 0:
                1
```

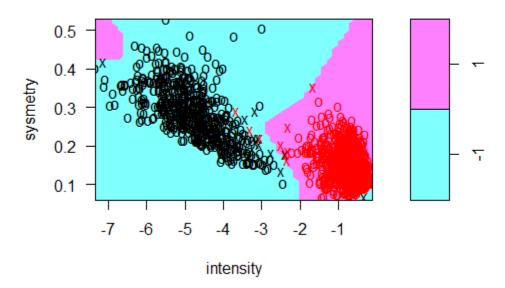
```
Number of Support Vectors:
                                    38
 (1919)
Number of Classes: 2
Level s:
 - 1 1
Call:
svm(formula = y_train ~ ., data = x_train_1[, -1], type = "C-classification",
    kernel = "polynomial", gamma = 1, coef0 = 1, degree = 5, cost = e)
Parameters:
 SVM-Type: C-classification
SVM-Kernel: polynomial
         cost:
                  5
      degree:
       gamma:
      coef. 0:
                  1
Number of Support Vectors: 22
 (11 11)
Number of Classes: 2
Level s:
 -11
[[1]]
[1] 0. 024343370 0. 005124920 0. 003203075 0. 002562460
[[2]]
[1] 0. 03773585 0. 01886792 0. 02358491 0. 02594340
```







SVM classification plot



> summary(tune.out)

Parameter tuning of 'svm':

- sampling method: 10-fold cross validation

```
- best parameters:
 cost
0. 1
- best performance: 0.003196962
- Detailed performance results:
                error di spersi on
1 1e-04 0. 216519680 0. 029963208
2 1e-03 0.036518047 0.013197018
3 1e-02 0.006402090 0.006034072
4 1e-01 0.003196962 0.004513521
5 1e+00 0.003196962 0.004513521
>
> choi ce5=c(0.01, 1, 100, 10000, 1000000)
> GError(choi ce5)
svm(formula = y_train \sim ., data = x_train_1[, -1], type = "C-classification",
    kernel = "radial", gamma = 1, cost = e
Parameters:
   SVM-Type:
               C-classification
                radi al
 SVM-Kernel:
        cost:
                0.01
       gamma:
                1
Number of Support Vectors:
 (257257)
Number of Classes:
Level s:
 - 1 1
Call:
svm(formul\, a = y\_trai\, n \sim .\,, \ data = x\_trai\, n\_1[\,, \ -1]\,, \ type = "C-classification", \\ kernel = "radi\, al", \ gamma = 1, \ cost = e)
Parameters:
                C-classification
   SVM-Type:
 SVM-Kernel:
               radi al
        cost:
                1
       gamma:
                1
Number of Support Vectors:
 (2218)
```

```
Number of Classes: 2
Level s:
- 1 1
Call:
Parameters:
             C-classification
  SVM-Type:
 SVM-Kernel:
             radi al
      cost:
            100
     gamma:
Number of Support Vectors:
                          23
 (149)
Number of Classes: 2
Level s:
- 1 1
svm(formul\, a = y\_trai\, n \sim .\,, \quad data = x\_trai\, n\_1[\,, \quad -1]\,, \quad type = "C-cl\, assi\, fi\, cati\, on"\,, \\ kernel = "radi\, al\,", \quad gamma = 1, \quad cost = e)
Parameters:
  SVM-Type:
            C-classification
 SVM-Kernel:
             radi al
      cost:
             10000
     gamma:
Number of Support Vectors: 16
 (88)
Number of Classes: 2
Level s:
- 1 1
Call:
Parameters:
```

C-classification radial

SVM-Type: SVM-Kernel: 1e+06

cost: gamma:

Number of Support Vectors:

(96)

Number of Classes: 2

Levels:

[[1]] [1] 0.005765535 0.003203075 0.002562460 0.001281230 0.000000000

[[2]] [1] 0. 01886792 0. 01886792 0. 01886792 0. 02594340 0. 02358491

>

