

AYUDANTÍA NO PRESENCIAL

1) MODELOS COMBINADOS

Cargar librerías

```
#install.packages("MASS")
#install.packages("randomForest")
#install.packages("ggplot2")
#install.packages("tibble")
#install.packages("dplyr")
#install.packages("ipred")
set.seed(125)
library(MASS)
library(randomForest)
library(ggplot2)
library(tibble)
library(dplyr)
library(ipred)
```

Cargar set de datos

Separamos en train y test.

NOTA:Dado que las etapas de preprocesamiento y transformacion no son el foco seran omitidas

```
data("Boston")
index <- sample(nrow(Boston), nrow(Boston)*0.70) # separar train/test
boston.train <- Boston[index,]
boston.test <- Boston[-index,]
rm(Boston)
```

Exploración del set

El data set tiene 14 columnas: 1 variables respuesta y 13 predictores.

```
head(Boston)
```

Bagging

En lugar de ajustar un único árbol, se ajustan muchos de ellos en paralelo formando un “bosque”. En cada nueva predicción, todos los árboles que forman el “bosque” participan aportando su predicción. Como valor final, se toma la media de todas las predicciones (variables continuas) o la clase más frecuente (variables cualitativas). Uno de los métodos de bagging más conocidos es Random Forest. El paquete de R “ipred”, tiene funciones facilitadoras para el Bagging.

Instalamos el paquete ipred

```
#install.packages("ipred")
library(ipred)
```

Bagging para un arbol de decisiones

Modelo simple de Bagging con 100 replicaciones. Calculamos el error cuadrático medio.

```
boston.bag<- bagging(medv~., data = boston.train, nbagg=100)
boston.bag.pred<- predict(boston.bag, newdata = boston.test)
```

```
mean((boston.test$medv-boston.bag.pred)^2)
rm(boston.bag,boston.bag.pred)
```

14.6008387807017

Para el caso de un árbol normal.

```
#install.packages("rpart")
library(rpart)
```

```
boston.tree<- rpart(medv~., data = boston.train)
boston.tree.pred<- predict(boston.tree, newdata = boston.test)
mean((boston.test$medv-boston.tree.pred)^2)
rm(boston.tree,boston.tree.pred)
```

21.1008575041993

Como podemos ver, ingresar árboles paralelos al modelo disminuye el error. Cabe preguntarse, ¿Hasta cuantos árboles es eficiente ingresar?

Numero optimo de arboles

```
ntree<- c(1, 3, 5, seq(10, 200, 10))
MSE.test<- rep(0, length(ntree))
for(i in 1:length(ntree)){
  boston.bag1<- bagging(medv~., data = boston.train, nbagg=ntree[i])
  boston.bag.pred1<- predict(boston.bag1, newdata = boston.test)
  MSE.test[i]<- mean((boston.test$medv-boston.bag.pred1)^2)
}
plot(ntree, MSE.test, type = 'l', col=2, lwd=2)
rm(boston.bag1,boston.bag.pred1)
```

Notar que a mayor cantidad de árboles llega un punto donde su ganancia marginal es nula. Además, ingresar demasiados árboles tiende a sobreajustarse a la base de entrenamiento, lo que perjudicaría el modelo y su capacidad de adaptarse a nuevos datos.

Out-of-bag (OOB)

OOB es una forma de validar un modelo de Random Forest. En cada iteración de Bootstrap, las muestras no usadas servirán para testear el modelo. Finalmente, se muestra el MSE disminuido.

```
boston.bag.oob<- bagging(medv~., data = boston.train, coob=T, nbagg=100)
boston.bag.oob # coob=T significa que sea TRUE el uso de OOB
rm(boston.bag.oob)
```

Bagging regression trees with 100 bootstrap replications

```
Call: bagging.data.frame(formula = medv ~ ., data = boston.train, coob = T,
  nbagg = 100)
```

Out-of-bag estimate of root mean squared error: 4.2551

RANDOM FOREST

Random Forest es un derivado del Bagging, y mejora significativamente la predicción. La idea es que, aleatoriamente, se selecciona un subconjunto de predictores como variables candidatas en cada separación

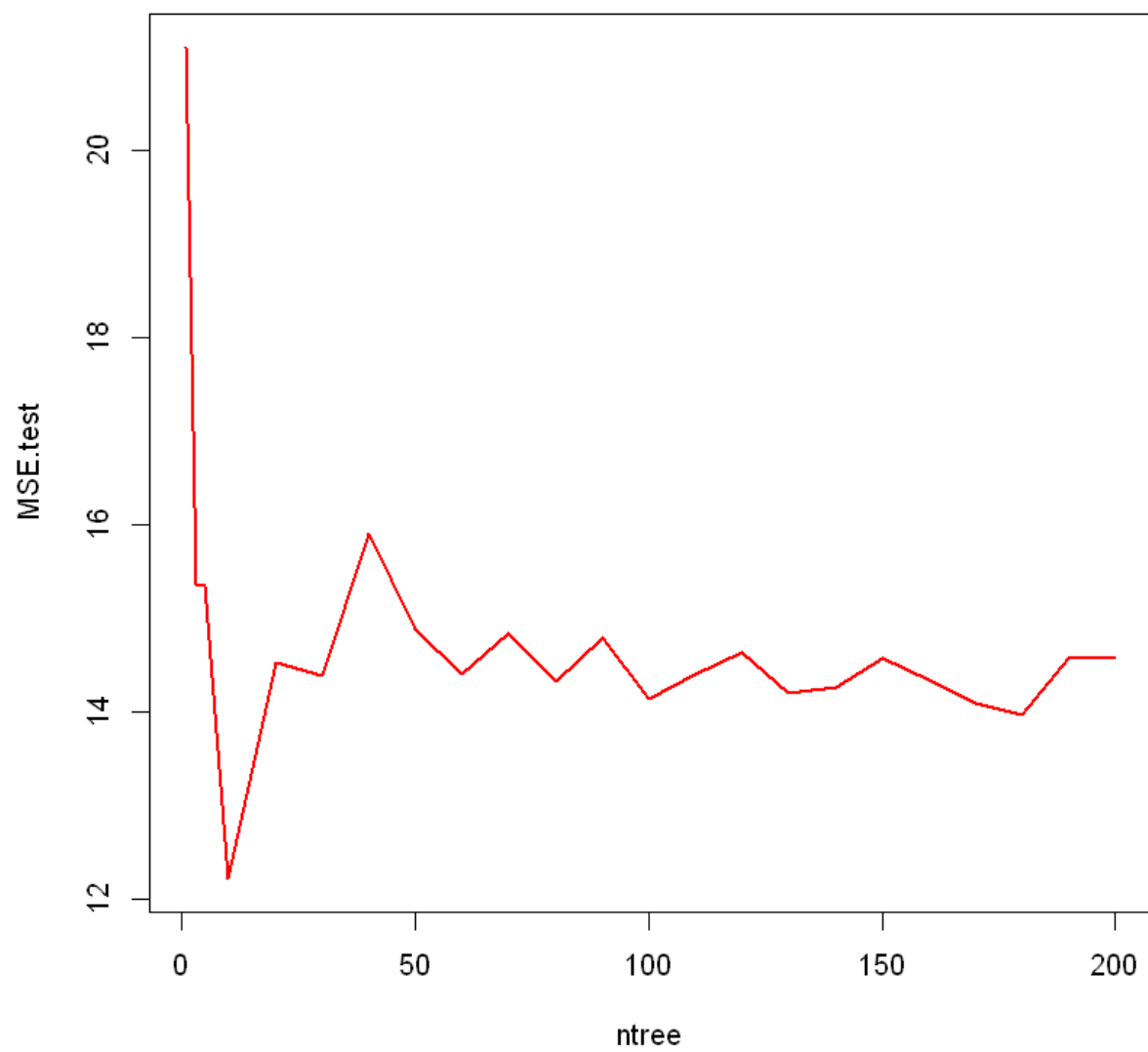


Figure 1: png

del árbol. La razón de esto es adaptarse a las correlaciones naturales entre las variables y los árboles, así se reduce la varianza al agregar árboles.

```
library(randomForest)
boston.rf<- randomForest(medv~., data = boston.train, importance=TRUE)
boston.rf
```

Call:

```
randomForest(formula = medv ~ ., data = boston.train, importance = TRUE)
      Type of random forest: regression
      Number of trees: 500
```

No. of variables tried at each split: 4

```
      Mean of squared residuals: 12.50255
      % Var explained: 85.06
```

Por defecto, el modelo de árbol de regresión utiliza un tercio de las variables como predictoras en cada iteración. Mientras que utiliza la raíz de las variables para las el problema de clasificación por defecto. En ambos casos se puede cambiar modificando el hiperparámetro **mtry=**. También se puede especificar el número de árboles con el hiperparámetro **ntree=**. por defecto se utilizan 500. El argumento **importance=TRUE** nos permite ver la importancia de cada variable en el modelo.

Tabla con Feature Importances

```
tabla<- rownames_to_column(data.frame(boston.rf$importance), "Variable")
tabla
```

A data.frame: 13 × 3

Variable

X.IncMSE

IncNodePurity

<chr>

<dbl>

<dbl>

crim

7.6486481

1722.89516

zn

0.9453036

277.94043

indus

8.4174948

2163.93997

chas

0.1716375

64.33896

nox

10.9156503
 2166.44884
 rm
 35.4212732
 8856.93299
 age
 5.2684310
 979.69613
 dis
 5.7751579
 1547.28728
 rad
 1.5132440
 320.90579
 tax
 4.0493400
 918.71034
 ptratio
 6.1823490
 1723.88378
 black
 1.0908891
 613.63540
 lstat
 51.1183895
 7617.72310

Gráfico con Feature Importances

```
tabla %>% ggplot(aes(y=X.IncMSE,x=Variable))+geom_bar(stat="identity")+
  coord_flip()+theme_classic()+
  geom_text(aes(x=Variable,y=X.IncMSE,label=X.IncMSE),hjust=0)
```

OBB y RANDOM FOREST

El Random Forest guarda todos los errores del OOB para cada ntree desde 1 a 500. podemos graficarlo para ver cómo el error OOB cambia según el número de árboles ntree.

```
plot(boston.rf$mse, type='l', col=2, lwd=2, xlab = "ntree", ylab = "OOB Error")
```

Podemos ver el error al aplicar el modelo en la base test

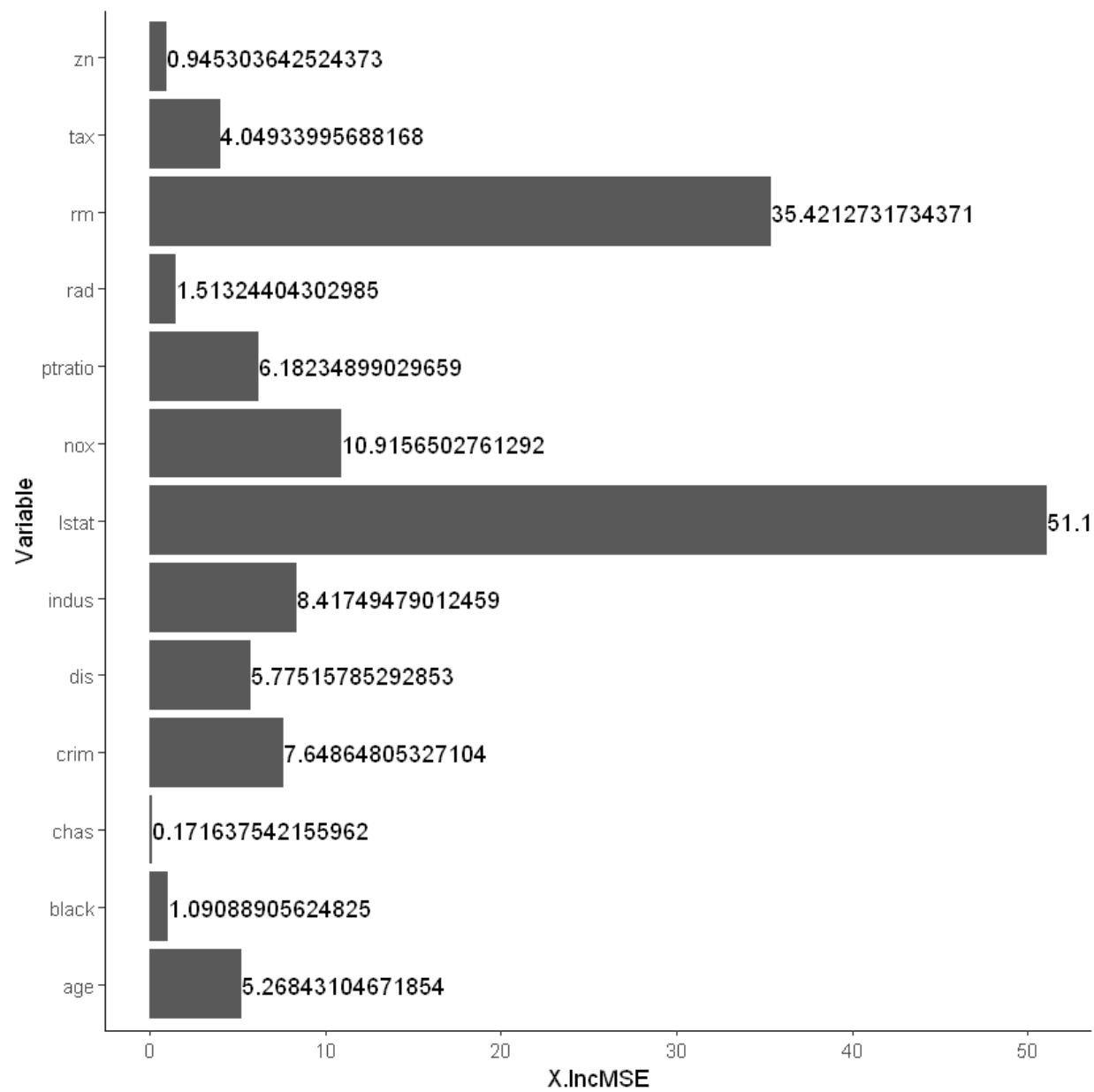


Figure 2: png

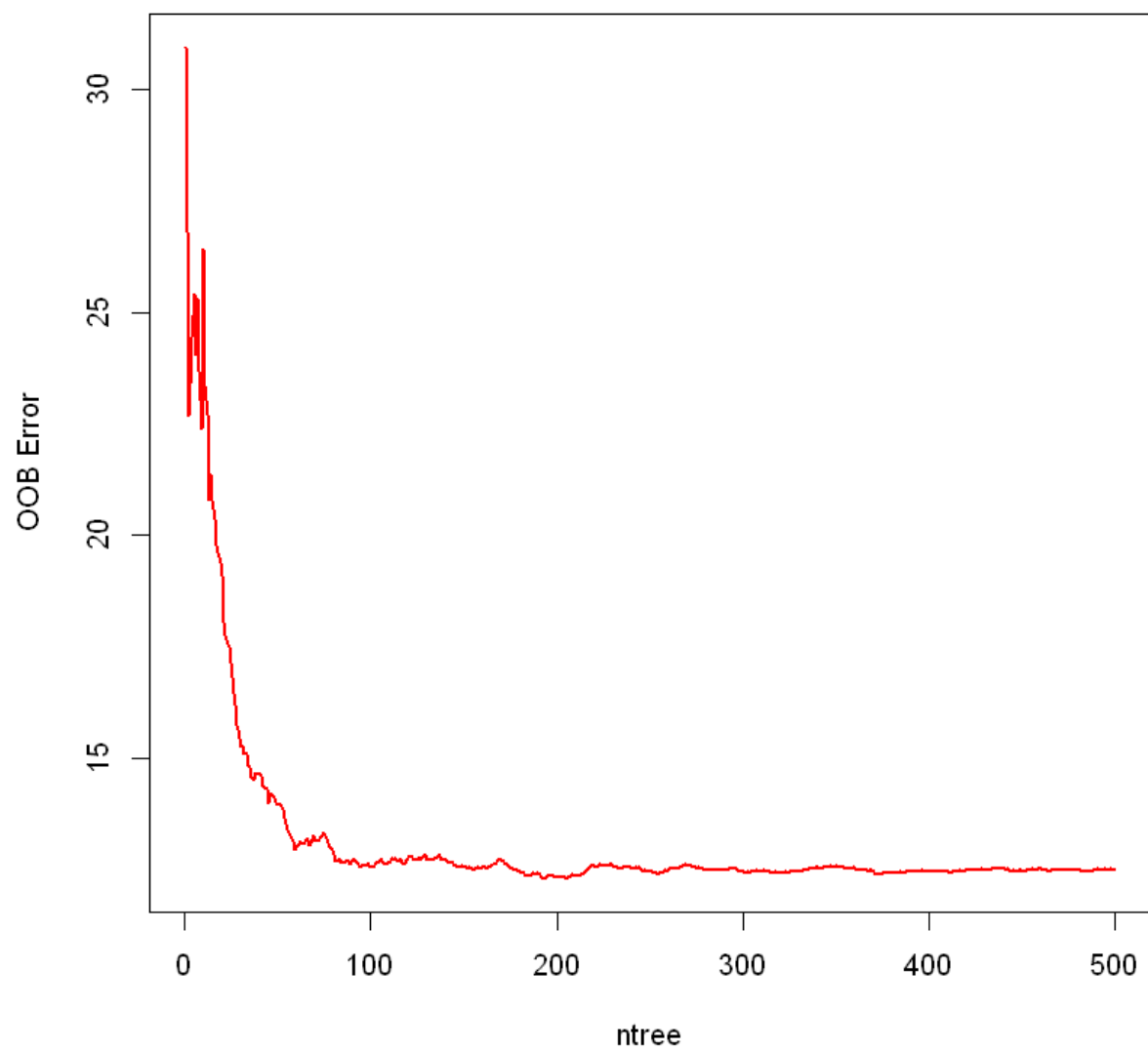


Figure 3: png

```
boston.rf.pred<- predict(boston.rf, boston.test)
mean((boston.test$medv-boston.rf.pred)^2)
rm(boston.rf)
```

10.7169607941446

Como se dijo previamente, el número de variables candidatas en cada iteración o separación es la raíz de las variables totales: Si son 13 variables, $m \sim 4$. También podemos especificar este número en el argumento **mtry**= . Ahora podemos graficar las diferencias del error en OOB y el testing y como éstos cambian según el hyperparametro **mtry**=

```
oob.err<- rep(0, 13)
test.err<- rep(0, 13)
for(i in 1:13){
  fit<- randomForest(medv~., data = boston.train, mtry=i)
  oob.err[i]<- fit$mse[500]
  test.err[i]<- mean((boston.test$medv-predict(fit, boston.test))^2)
  cat(i, " ")
}
matplot(cbind(test.err, oob.err), pch=15, col = c("red", "blue"), type = "b", ylab = "MSE", xlab = "mtry",
  legend("topright", legend = c("test Error", "OOB Error"), pch = 15, col = c("red", "blue")))
```

1 2 3 4 5 6 7 8 9 10 11 12 13

Error in matplot(cbind(test.err, oob.err), pch = 15, col = c("red", "blue"), : argumento no-numérico para pch
Traceback:

BOOSTING

Consiste en ajustar secuencialmente múltiples modelos sencillos, llamados weak learners, de forma que cada modelo aprende de los errores del anterior. Como valor final, al igual que en bagging, se toma la media de todas las predicciones (variables continuas) o la clase más frecuente (variables cualitativas). Tres de los métodos de boosting más empleados son AdaBoost, Gradient Boosting y * Stochastic Gradient Boosting*.

```
install.packages("gbm")
library(gbm)
```

Installing package into 'C:/Users/feseg/OneDrive/Documentos/R/win-library/3.6'
(as 'lib' is unspecified)

package 'gbm' successfully unpacked and MD5 sums checked

Warning message:

"cannot remove prior installation of package 'gbm'"
Warning message in file.copy(savedcopy, lib, recursive=TRUE):
"problema al copiar C:\Users\feseg\OneDrive\Documentos\R\win-library\3.6\00LOCK\gbm\libs\x64\gbm.dll a C:\Users\feseg\OneDrive\Documentos\R\win-library\3.6\00LOCK\gbm\libs\x64\gbm.dll"
"restored 'gbm'"

The downloaded binary packages are in

C:\Users\feseg\AppData\Local\Temp\RtmpqqKUBs\downloaded_packages

Loaded gbm 2.1.5

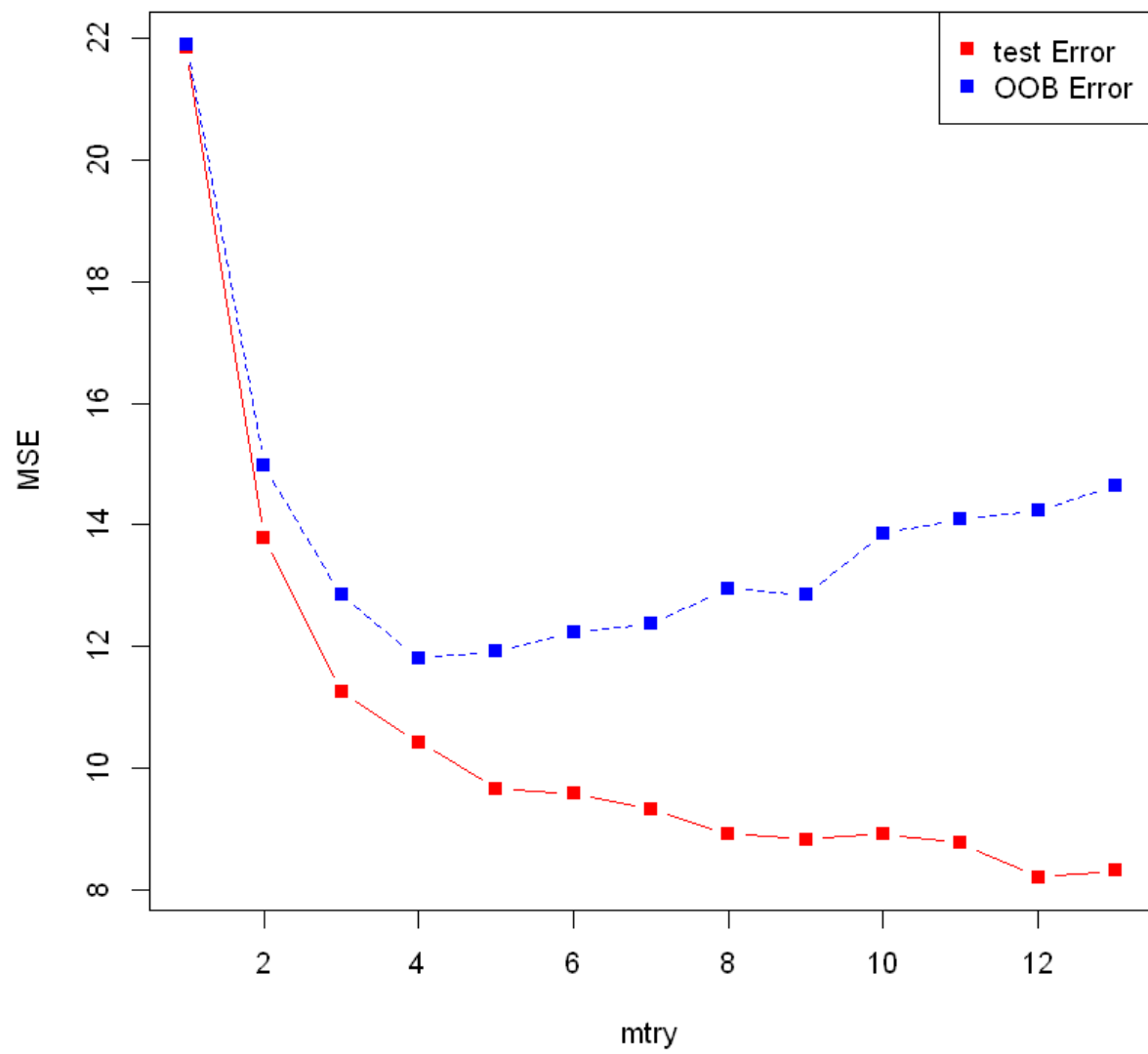


Figure 4: png

```

boston.boost<- gbm(medv~., data = boston.train, distribution = "gaussian",
                   n.trees = 10000, shrinkage = 0.01, interaction.depth = 8)
summary(boston.boost)

boston.boost.pred.test<- predict(boston.boost, boston.test, n.trees = 10000)
mean((boston.test$medv-boston.boost.pred.test)^2)

```

A data.frame: 13 × 2

var

rel.inf

<fct>

<dbl>

lstat

lstat

35.05254078

rm

rm

33.46763381

dis

dis

7.43413837

nox

nox

5.14080480

crim

crim

4.88776641

age

age

3.85606598

ptratio

ptratio

2.99971204

black

black

2.70122402

tax

tax

2.32318795

indus

indus

1.24348825

rad

rad

0.65065339

zn

zn

0.14796637

chas

chas

0.09481782

9.18446843327496

Notar que debemos especificar el tipo de distribución en `distribution = "gaussian"` al trabajar en árboles de regresión. Por defecto esto trabaja en distribución **Bernoulli** para clasificación binaria.

- **n.trees** corresponde al número de árboles a ajustar. A mayor n.trees podría haber mayor sobreajuste.
- **shrinkage** es un argumento para decidir cuanta contribución aporta cada nuevo árbol al modelo.
- **interaction.depth** es cuantas separaciones tendrá cada árbol.

La mejor manera de ajustar estos parámetros es mediante Validación cruzada y grid search (que se verá en la respectiva ayudantía).

```
ntree<- seq(100, 10000, 100)
predmat<- predict(boston.boost, newdata = boston.test, n.trees = ntree)
err<- apply((predmat-boston.test$medv)^2, 2, mean)
plot(ntree, err, type = 'l', col=2, lwd=2, xlab = "n.trees", ylab = "Test MSE")
abline(h=min(test.err), lty=2)
```

2) GRID SEARCH

El paquete caret R proporciona un Gridsearch donde puede especificar los parámetros para tratar su problema. Y probará todas las combinaciones y localizará la combinación que ofrezca los mejores resultados. No todos los algoritmos de aprendizaje automático están disponibles para el ajuste. En <https://topepo.github.io/caret/available-models.html> pueden verificar que parámetros del modelo de caret se pueden ajustar.

Cargar librerías

```
#install.packages("mlbench")
#install.packages("caret")
#install.packages("e1071")
library(mlbench)
library(caret)
library(e1071)
set.seed(1)
```

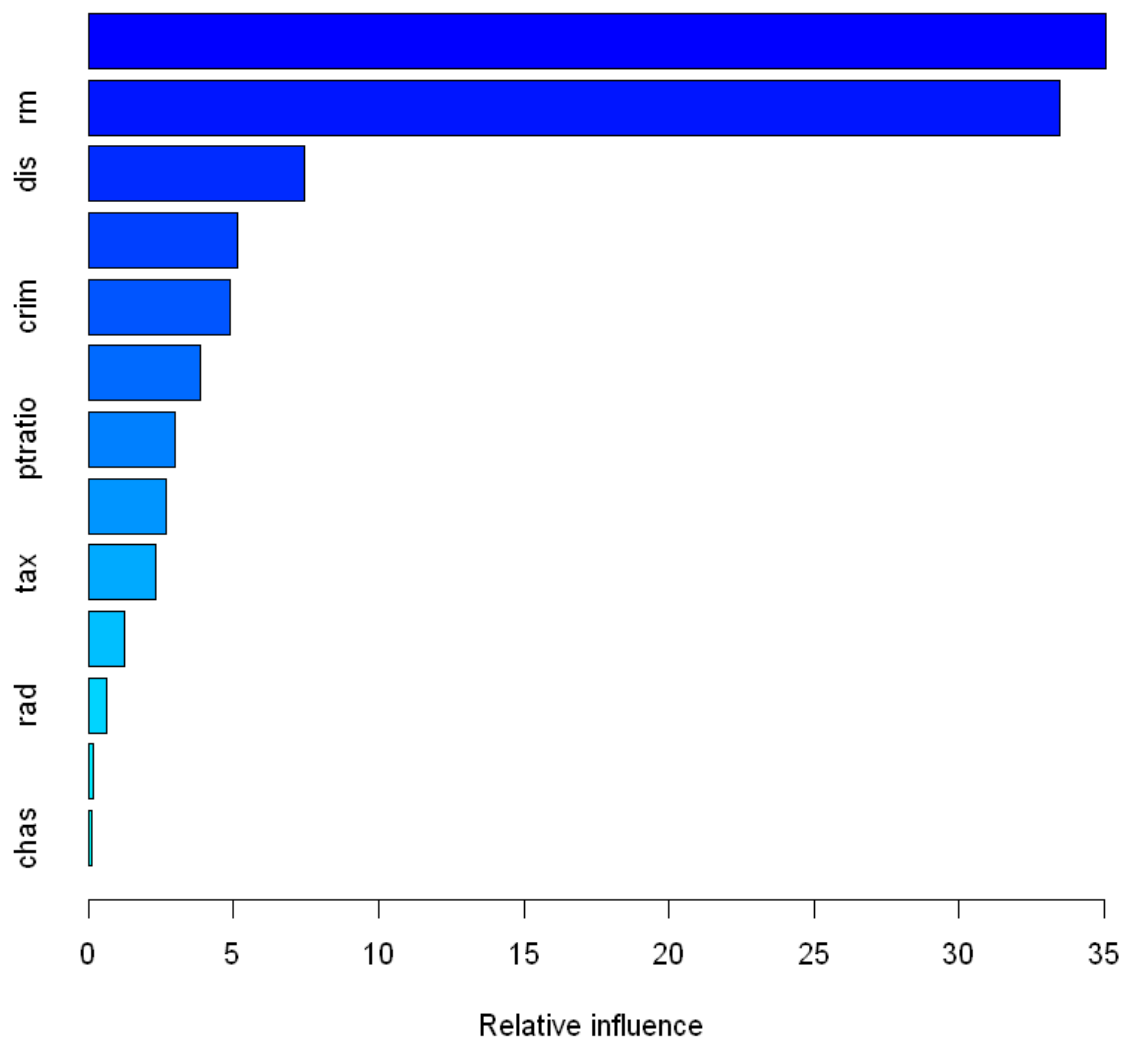


Figure 5: png

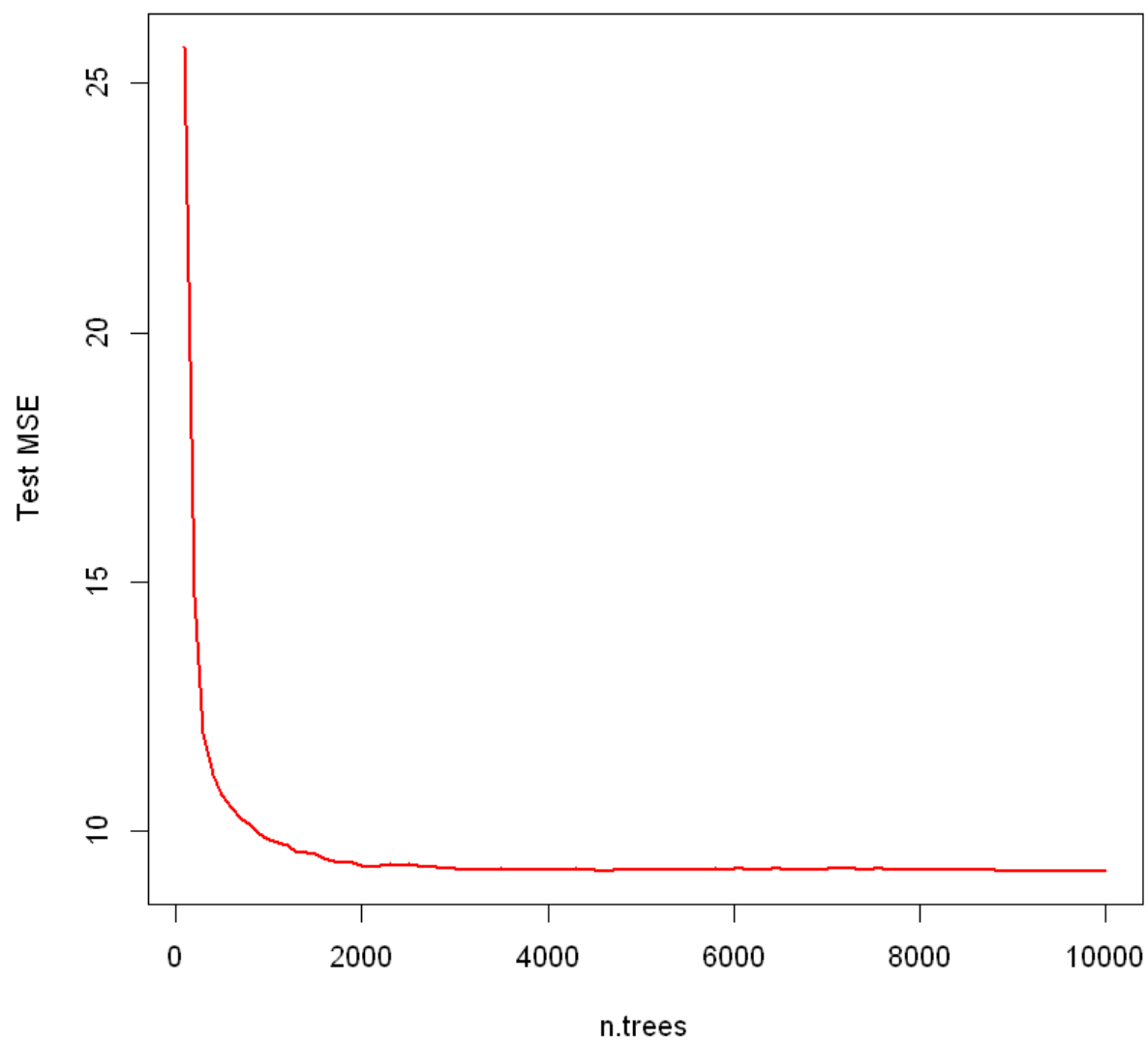


Figure 6: png

Cargamos la base

Particionamos la base en training y testing

DADO QUE LAS ETAPAS DE PREPROCESAMIENTO Y TRANSFORMACION NO SON EL FOCO DE ESTA AYUDANTIA SERAN OMITIDAS.

```
data(Sonar)
Base <- Sonar
Variables <- Base[,1:60]
Clase <- Base[,61]

inTraining <- createDataPartition(Base$Class, p = .70, list =FALSE)

#Training corresponde al 70% de la base train
training <- Base[inTraining,]

#Testing corresponde al restante 30% de la base train
testing <- Base[-inTraining,]
```

Exploración de la base

```
head(Sonar)
```

A data.frame: 6 × 61

V1
V2
V3
V4
V5
V6
V7
V8
V9
V10
...
V52
V53
V54
V55
V56
V57
V58
V59
V60

Class

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

...

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<fct>

0.0200

0.0371

0.0428

0.0207

0.0954

0.0986

0.1539

0.1601

0.3109

0.2111

...

0.0027

0.0065

0.0159

0.0072

0.0167

0.0180

0.0084

0.0090

0.0032

R

0.0453

0.0523

0.0843

0.0689

0.1183

0.2583

0.2156

0.3481

0.3337

0.2872

...

0.0084

0.0089

0.0048

0.0094

0.0191

0.0140

0.0049

0.0052

0.0044

R

0.0262

0.0582

0.1099

0.1083

0.0974

0.2280

0.2431

0.3771

0.5598

0.6194

...

0.0232

0.0166

0.0095

0.0180

0.0244

0.0316

0.0164

0.0095

0.0078

R

0.0100

0.0171

0.0623

0.0205

0.0205

0.0368

0.1098

0.1276

0.0598

0.1264

...

0.0121

0.0036

0.0150

0.0085

0.0073

0.0050

0.0044

0.0040

0.0117

R

0.0762

0.0666

0.0481

0.0394

0.0590

0.0649

0.1209

0.2467

0.3564

0.4459

...

0.0031

0.0054

0.0105

0.0110

0.0015

0.0072

0.0048

0.0107

0.0094

R

0.0286

0.0453

0.0277

0.0174

0.0384

0.0990

0.1201

0.1833

0.2105

0.3039

...

0.0045

0.0014

0.0038

0.0013

0.0089

0.0057

0.0027

0.0051

0.0062

R

Primera opción de Grid Search: Automatic Grid

Permite que el sistema lo haga automáticamente. Esto se puede hacer configurando **tuneLength** para indicar el número de valores diferentes para probar para cada parámetro del algoritmo.

OJO: ESTE MÉTODO PUEDE TOMAR ARTO TIEMPO COMPUTACIONAL Y EN ESPECIAL CUANDO ELIGEN UN **tunelength** MUY GRANDE

MODELO SVM

El modelo **svmPoly** tiene como parametros: degree, scale, C

C: es el parámetro de regularización, C, del término de error es el grado de la función del núcleo polinomial ('poli') y es ignorado por todos los demás núcleos. El valor predeterminado es 3.

- El código en la celda a continuación utiliza la capacidad del paquete R Caret para estimar los mejores hiperparámetros usando la validación cruzada 5 veces. Esta primera validación cruzada se realiza utilizando ROC como la métrica. Hay algunos puntos a tener en cuenta aquí:
- **trainControl** se utiliza para definir el entrenamiento. Por ejemplo:
 - **method = cv** corresponde a la cross-validation y **number=10** corresponde a 10 fold.
 - Se especifica la función **twoClassSummary**, lo que convierte a ROC en la métrica para la optimización de hiperparámetros.
 - El argumento **tuneLength** le dice al algoritmo que pruebe diferentes valores predeterminados para el parámetro principal

```
control_svm <- trainControl(method='cv',
                             number=10,

                             verboseIter = TRUE,
                             summaryFunction = twoClassSummary,
                             classProbs = TRUE)
# Entrenamiento de la base training utilizando el metodo de support vector machine con AUTOMATIC GRID
model_SVM_AG <- train(
  Class ~ ., training,
  method = "svmPoly",
  trControl = control_svm,
  tuneLength = 6,
  metric ="ROC"
)
```

```
+ Fold01: degree=1, scale=1e-03, C=0.25
- Fold01: degree=1, scale=1e-03, C=0.25
+ Fold01: degree=2, scale=1e-03, C=0.25
- Fold01: degree=2, scale=1e-03, C=0.25
+ Fold01: degree=3, scale=1e-03, C=0.25
- Fold01: degree=3, scale=1e-03, C=0.25
+ Fold01: degree=1, scale=1e-02, C=0.25
```

- Fold01: degree=1, scale=1e-02, C=0.25
 + Fold01: degree=2, scale=1e-02, C=0.25
 - Fold01: degree=2, scale=1e-02, C=0.25
 + Fold01: degree=3, scale=1e-02, C=0.25
 - Fold01: degree=3, scale=1e-02, C=0.25
 + Fold01: degree=1, scale=1e-01, C=0.25
 - Fold01: degree=1, scale=1e-01, C=0.25
 + Fold01: degree=2, scale=1e-01, C=0.25
 - Fold01: degree=2, scale=1e-01, C=0.25
 + Fold01: degree=3, scale=1e-01, C=0.25
 - Fold01: degree=3, scale=1e-01, C=0.25
 + Fold01: degree=1, scale=1e+00, C=0.25
 - Fold01: degree=1, scale=1e+00, C=0.25
 + Fold01: degree=2, scale=1e+00, C=0.25
 - Fold01: degree=2, scale=1e+00, C=0.25
 + Fold01: degree=3, scale=1e+00, C=0.25
 - Fold01: degree=3, scale=1e+00, C=0.25
 + Fold01: degree=1, scale=1e+01, C=0.25
 - Fold01: degree=1, scale=1e+01, C=0.25
 + Fold01: degree=2, scale=1e+01, C=0.25
 - Fold01: degree=2, scale=1e+01, C=0.25
 + Fold01: degree=3, scale=1e+01, C=0.25
 - Fold01: degree=3, scale=1e+01, C=0.25
 + Fold01: degree=1, scale=1e+02, C=0.25
 - Fold01: degree=1, scale=1e+02, C=0.25
 + Fold01: degree=2, scale=1e+02, C=0.25
 - Fold01: degree=2, scale=1e+02, C=0.25
 + Fold01: degree=3, scale=1e+02, C=0.25
 - Fold01: degree=3, scale=1e+02, C=0.25
 + Fold01: degree=1, scale=1e-03, C=0.50
 - Fold01: degree=1, scale=1e-03, C=0.50
 + Fold01: degree=2, scale=1e-03, C=0.50
 - Fold01: degree=2, scale=1e-03, C=0.50
 + Fold01: degree=3, scale=1e-03, C=0.50
 - Fold01: degree=3, scale=1e-03, C=0.50
 + Fold01: degree=1, scale=1e-02, C=0.50
 - Fold01: degree=1, scale=1e-02, C=0.50
 + Fold01: degree=2, scale=1e-02, C=0.50
 - Fold01: degree=2, scale=1e-02, C=0.50
 + Fold01: degree=3, scale=1e-02, C=0.50
 - Fold01: degree=3, scale=1e-02, C=0.50
 + Fold01: degree=1, scale=1e-01, C=0.50
 - Fold01: degree=1, scale=1e-01, C=0.50
 + Fold01: degree=2, scale=1e-01, C=0.50
 - Fold01: degree=2, scale=1e-01, C=0.50
 + Fold01: degree=3, scale=1e-01, C=0.50
 - Fold01: degree=3, scale=1e-01, C=0.50
 + Fold01: degree=1, scale=1e+00, C=0.50
 - Fold01: degree=1, scale=1e+00, C=0.50
 + Fold01: degree=2, scale=1e+00, C=0.50
 - Fold01: degree=2, scale=1e+00, C=0.50
 + Fold01: degree=3, scale=1e+00, C=0.50
 - Fold01: degree=3, scale=1e+00, C=0.50
 + Fold01: degree=1, scale=1e+01, C=0.50

```

- Fold01: degree=1, scale=1e+01, C=0.50
+ Fold01: degree=2, scale=1e+01, C=0.50
- Fold01: degree=2, scale=1e+01, C=0.50
+ Fold01: degree=3, scale=1e+01, C=0.50
- Fold01: degree=3, scale=1e+01, C=0.50
+ Fold01: degree=1, scale=1e+02, C=0.50
- Fold01: degree=1, scale=1e+02, C=0.50
+ Fold01: degree=2, scale=1e+02, C=0.50
- Fold01: degree=2, scale=1e+02, C=0.50
+ Fold01: degree=3, scale=1e+02, C=0.50
- Fold01: degree=3, scale=1e+02, C=0.50
+ Fold01: degree=1, scale=1e-03, C=1.00
- Fold01: degree=1, scale=1e-03, C=1.00
+ Fold01: degree=2, scale=1e-03, C=1.00
- Fold01: degree=2, scale=1e-03, C=1.00
+ Fold01: degree=3, scale=1e-03, C=1.00
- Fold01: degree=3, scale=1e-03, C=1.00
+ Fold01: degree=1, scale=1e-02, C=1.00
- Fold01: degree=1, scale=1e-02, C=1.00
+ Fold01: degree=2, scale=1e-02, C=1.00
- Fold01: degree=2, scale=1e-02, C=1.00
+ Fold01: degree=3, scale=1e-02, C=1.00
- Fold01: degree=3, scale=1e-02, C=1.00
+ Fold01: degree=1, scale=1e-01, C=1.00
- Fold01: degree=1, scale=1e-01, C=1.00
+ Fold01: degree=2, scale=1e-01, C=1.00
- Fold01: degree=2, scale=1e-01, C=1.00
+ Fold01: degree=3, scale=1e-01, C=1.00
- Fold01: degree=3, scale=1e-01, C=1.00
+ Fold01: degree=1, scale=1e+00, C=1.00
- Fold01: degree=1, scale=1e+00, C=1.00
+ Fold01: degree=2, scale=1e+00, C=1.00
- Fold01: degree=2, scale=1e+00, C=1.00
+ Fold01: degree=3, scale=1e+00, C=1.00
- Fold01: degree=3, scale=1e+00, C=1.00
+ Fold01: degree=1, scale=1e+01, C=1.00
- Fold01: degree=1, scale=1e+01, C=1.00
+ Fold01: degree=2, scale=1e+01, C=1.00
- Fold01: degree=2, scale=1e+01, C=1.00
+ Fold01: degree=3, scale=1e+01, C=1.00
- Fold01: degree=3, scale=1e+01, C=1.00
+ Fold01: degree=1, scale=1e+02, C=1.00
- Fold01: degree=1, scale=1e+02, C=1.00
+ Fold01: degree=2, scale=1e+02, C=1.00
- Fold01: degree=2, scale=1e+02, C=1.00
+ Fold01: degree=3, scale=1e+02, C=1.00
- Fold01: degree=3, scale=1e+02, C=1.00
+ Fold01: degree=1, scale=1e-03, C=2.00
- Fold01: degree=1, scale=1e-03, C=2.00
+ Fold01: degree=2, scale=1e-03, C=2.00
- Fold01: degree=2, scale=1e-03, C=2.00
+ Fold01: degree=3, scale=1e-03, C=2.00
- Fold01: degree=3, scale=1e-03, C=2.00
+ Fold01: degree=1, scale=1e-02, C=2.00

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```

- Fold01: degree=1, scale=1e-02, C=2.00
+ Fold01: degree=2, scale=1e-02, C=2.00
- Fold01: degree=2, scale=1e-02, C=2.00
+ Fold01: degree=3, scale=1e-02, C=2.00
- Fold01: degree=3, scale=1e-02, C=2.00
+ Fold01: degree=1, scale=1e-01, C=2.00
- Fold01: degree=1, scale=1e-01, C=2.00
+ Fold01: degree=2, scale=1e-01, C=2.00
- Fold01: degree=2, scale=1e-01, C=2.00
+ Fold01: degree=3, scale=1e-01, C=2.00
- Fold01: degree=3, scale=1e-01, C=2.00
+ Fold01: degree=1, scale=1e+00, C=2.00
- Fold01: degree=1, scale=1e+00, C=2.00
+ Fold01: degree=2, scale=1e+00, C=2.00
- Fold01: degree=2, scale=1e+00, C=2.00
+ Fold01: degree=3, scale=1e+00, C=2.00
- Fold01: degree=3, scale=1e+00, C=2.00
+ Fold01: degree=1, scale=1e+01, C=2.00
- Fold01: degree=1, scale=1e+01, C=2.00
+ Fold01: degree=2, scale=1e+01, C=2.00
- Fold01: degree=2, scale=1e+01, C=2.00
+ Fold01: degree=3, scale=1e+01, C=2.00
- Fold01: degree=3, scale=1e+01, C=2.00
+ Fold01: degree=1, scale=1e+02, C=2.00
- Fold01: degree=1, scale=1e+02, C=2.00
+ Fold01: degree=2, scale=1e+02, C=2.00
- Fold01: degree=2, scale=1e+02, C=2.00
+ Fold01: degree=3, scale=1e+02, C=2.00
- Fold01: degree=3, scale=1e+02, C=2.00
+ Fold01: degree=1, scale=1e-03, C=4.00
- Fold01: degree=1, scale=1e-03, C=4.00
+ Fold01: degree=2, scale=1e-03, C=4.00
- Fold01: degree=2, scale=1e-03, C=4.00
+ Fold01: degree=3, scale=1e-03, C=4.00
- Fold01: degree=3, scale=1e-03, C=4.00
+ Fold01: degree=1, scale=1e-02, C=4.00
- Fold01: degree=1, scale=1e-02, C=4.00
+ Fold01: degree=2, scale=1e-02, C=4.00
- Fold01: degree=2, scale=1e-02, C=4.00
+ Fold01: degree=3, scale=1e-02, C=4.00
- Fold01: degree=3, scale=1e-02, C=4.00
+ Fold01: degree=1, scale=1e-01, C=4.00
- Fold01: degree=1, scale=1e-01, C=4.00
+ Fold01: degree=2, scale=1e-01, C=4.00
- Fold01: degree=2, scale=1e-01, C=4.00
+ Fold01: degree=3, scale=1e-01, C=4.00
- Fold01: degree=3, scale=1e-01, C=4.00
+ Fold01: degree=1, scale=1e+00, C=4.00
- Fold01: degree=1, scale=1e+00, C=4.00
+ Fold01: degree=2, scale=1e+00, C=4.00
- Fold01: degree=2, scale=1e+00, C=4.00
+ Fold01: degree=3, scale=1e+00, C=4.00
- Fold01: degree=3, scale=1e+00, C=4.00
+ Fold01: degree=1, scale=1e+01, C=4.00

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- Fold01: degree=1, scale=1e+01, C=4.00
 + Fold01: degree=2, scale=1e+01, C=4.00
 - Fold01: degree=2, scale=1e+01, C=4.00
 + Fold01: degree=3, scale=1e+01, C=4.00
 - Fold01: degree=3, scale=1e+01, C=4.00
 + Fold01: degree=1, scale=1e+02, C=4.00
 - Fold01: degree=1, scale=1e+02, C=4.00
 + Fold01: degree=2, scale=1e+02, C=4.00
 - Fold01: degree=2, scale=1e+02, C=4.00
 + Fold01: degree=3, scale=1e+02, C=4.00
 - Fold01: degree=3, scale=1e+02, C=4.00
 + Fold01: degree=1, scale=1e-03, C=8.00
 - Fold01: degree=1, scale=1e-03, C=8.00
 + Fold01: degree=2, scale=1e-03, C=8.00
 - Fold01: degree=2, scale=1e-03, C=8.00
 + Fold01: degree=3, scale=1e-03, C=8.00
 - Fold01: degree=3, scale=1e-03, C=8.00
 + Fold01: degree=1, scale=1e-02, C=8.00
 - Fold01: degree=1, scale=1e-02, C=8.00
 + Fold01: degree=2, scale=1e-02, C=8.00
 - Fold01: degree=2, scale=1e-02, C=8.00
 + Fold01: degree=3, scale=1e-02, C=8.00
 - Fold01: degree=3, scale=1e-02, C=8.00
 + Fold01: degree=1, scale=1e-01, C=8.00
 - Fold01: degree=1, scale=1e-01, C=8.00
 + Fold01: degree=2, scale=1e-01, C=8.00
 - Fold01: degree=2, scale=1e-01, C=8.00
 + Fold01: degree=3, scale=1e-01, C=8.00
 - Fold01: degree=3, scale=1e-01, C=8.00
 + Fold01: degree=1, scale=1e+00, C=8.00
 - Fold01: degree=1, scale=1e+00, C=8.00
 + Fold01: degree=2, scale=1e+00, C=8.00
 - Fold01: degree=2, scale=1e+00, C=8.00
 + Fold01: degree=3, scale=1e+00, C=8.00
 - Fold01: degree=3, scale=1e+00, C=8.00
 + Fold01: degree=1, scale=1e+01, C=8.00
 - Fold01: degree=1, scale=1e+01, C=8.00
 + Fold01: degree=2, scale=1e+01, C=8.00
 - Fold01: degree=2, scale=1e+01, C=8.00
 + Fold01: degree=3, scale=1e+01, C=8.00
 - Fold01: degree=3, scale=1e+01, C=8.00
 + Fold01: degree=1, scale=1e+02, C=8.00
 - Fold01: degree=1, scale=1e+02, C=8.00
 + Fold01: degree=2, scale=1e+02, C=8.00
 - Fold01: degree=2, scale=1e+02, C=8.00
 + Fold01: degree=3, scale=1e+02, C=8.00
 - Fold01: degree=3, scale=1e+02, C=8.00
 + Fold02: degree=1, scale=1e-03, C=0.25
 - Fold02: degree=1, scale=1e-03, C=0.25
 + Fold02: degree=2, scale=1e-03, C=0.25
 - Fold02: degree=2, scale=1e-03, C=0.25
 + Fold02: degree=3, scale=1e-03, C=0.25
 - Fold02: degree=3, scale=1e-03, C=0.25
 + Fold02: degree=1, scale=1e-02, C=0.25

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- Fold02: degree=1, scale=1e-02, C=0.25
+ Fold02: degree=2, scale=1e-02, C=0.25
- Fold02: degree=2, scale=1e-02, C=0.25
+ Fold02: degree=3, scale=1e-02, C=0.25
- Fold02: degree=3, scale=1e-02, C=0.25
+ Fold02: degree=1, scale=1e-01, C=0.25
- Fold02: degree=1, scale=1e-01, C=0.25
+ Fold02: degree=2, scale=1e-01, C=0.25
- Fold02: degree=2, scale=1e-01, C=0.25
+ Fold02: degree=3, scale=1e-01, C=0.25
- Fold02: degree=3, scale=1e-01, C=0.25
+ Fold02: degree=1, scale=1e+00, C=0.25
- Fold02: degree=1, scale=1e+00, C=0.25
+ Fold02: degree=2, scale=1e+00, C=0.25
- Fold02: degree=2, scale=1e+00, C=0.25
+ Fold02: degree=3, scale=1e+00, C=0.25
- Fold02: degree=3, scale=1e+00, C=0.25
+ Fold02: degree=1, scale=1e+01, C=0.25
- Fold02: degree=1, scale=1e+01, C=0.25
+ Fold02: degree=2, scale=1e+01, C=0.25
- Fold02: degree=2, scale=1e+01, C=0.25
+ Fold02: degree=3, scale=1e+01, C=0.25
- Fold02: degree=3, scale=1e+01, C=0.25
+ Fold02: degree=1, scale=1e+02, C=0.25
- Fold02: degree=1, scale=1e+02, C=0.25
+ Fold02: degree=2, scale=1e+02, C=0.25
- Fold02: degree=2, scale=1e+02, C=0.25
+ Fold02: degree=3, scale=1e+02, C=0.25
- Fold02: degree=3, scale=1e+02, C=0.25
+ Fold02: degree=1, scale=1e-03, C=0.50
- Fold02: degree=1, scale=1e-03, C=0.50
+ Fold02: degree=2, scale=1e-03, C=0.50
- Fold02: degree=2, scale=1e-03, C=0.50
+ Fold02: degree=3, scale=1e-03, C=0.50
- Fold02: degree=3, scale=1e-03, C=0.50
+ Fold02: degree=1, scale=1e-02, C=0.50
- Fold02: degree=1, scale=1e-02, C=0.50
+ Fold02: degree=2, scale=1e-02, C=0.50
- Fold02: degree=2, scale=1e-02, C=0.50
+ Fold02: degree=3, scale=1e-02, C=0.50
- Fold02: degree=3, scale=1e-02, C=0.50
+ Fold02: degree=1, scale=1e-01, C=0.50
- Fold02: degree=1, scale=1e-01, C=0.50
+ Fold02: degree=2, scale=1e-01, C=0.50
- Fold02: degree=2, scale=1e-01, C=0.50
+ Fold02: degree=3, scale=1e-01, C=0.50
- Fold02: degree=3, scale=1e-01, C=0.50
+ Fold02: degree=1, scale=1e+00, C=0.50
- Fold02: degree=1, scale=1e+00, C=0.50
+ Fold02: degree=2, scale=1e+00, C=0.50
- Fold02: degree=2, scale=1e+00, C=0.50
+ Fold02: degree=3, scale=1e+00, C=0.50
- Fold02: degree=3, scale=1e+00, C=0.50
+ Fold02: degree=1, scale=1e+01, C=0.50

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- Fold02: degree=1, scale=1e+01, C=0.50
+ Fold02: degree=2, scale=1e+01, C=0.50
- Fold02: degree=2, scale=1e+01, C=0.50
+ Fold02: degree=3, scale=1e+01, C=0.50
- Fold02: degree=3, scale=1e+01, C=0.50
+ Fold02: degree=1, scale=1e+02, C=0.50
- Fold02: degree=1, scale=1e+02, C=0.50
+ Fold02: degree=2, scale=1e+02, C=0.50
- Fold02: degree=2, scale=1e+02, C=0.50
+ Fold02: degree=3, scale=1e+02, C=0.50
- Fold02: degree=3, scale=1e+02, C=0.50
+ Fold02: degree=1, scale=1e-03, C=1.00
- Fold02: degree=1, scale=1e-03, C=1.00
+ Fold02: degree=2, scale=1e-03, C=1.00
- Fold02: degree=2, scale=1e-03, C=1.00
+ Fold02: degree=3, scale=1e-03, C=1.00
- Fold02: degree=3, scale=1e-03, C=1.00
+ Fold02: degree=1, scale=1e-02, C=1.00
- Fold02: degree=1, scale=1e-02, C=1.00
+ Fold02: degree=2, scale=1e-02, C=1.00
- Fold02: degree=2, scale=1e-02, C=1.00
+ Fold02: degree=3, scale=1e-02, C=1.00
- Fold02: degree=3, scale=1e-02, C=1.00
+ Fold02: degree=1, scale=1e-01, C=1.00
- Fold02: degree=1, scale=1e-01, C=1.00
+ Fold02: degree=2, scale=1e-01, C=1.00
- Fold02: degree=2, scale=1e-01, C=1.00
+ Fold02: degree=3, scale=1e-01, C=1.00
- Fold02: degree=3, scale=1e-01, C=1.00
+ Fold02: degree=1, scale=1e+00, C=1.00
- Fold02: degree=1, scale=1e+00, C=1.00
+ Fold02: degree=2, scale=1e+00, C=1.00
- Fold02: degree=2, scale=1e+00, C=1.00
+ Fold02: degree=3, scale=1e+00, C=1.00
- Fold02: degree=3, scale=1e+00, C=1.00
+ Fold02: degree=1, scale=1e+01, C=1.00
- Fold02: degree=1, scale=1e+01, C=1.00
+ Fold02: degree=2, scale=1e+01, C=1.00
- Fold02: degree=2, scale=1e+01, C=1.00
+ Fold02: degree=3, scale=1e+01, C=1.00
- Fold02: degree=3, scale=1e+01, C=1.00
+ Fold02: degree=1, scale=1e+02, C=1.00
- Fold02: degree=1, scale=1e+02, C=1.00
+ Fold02: degree=2, scale=1e+02, C=1.00
- Fold02: degree=2, scale=1e+02, C=1.00
+ Fold02: degree=3, scale=1e+02, C=1.00
- Fold02: degree=3, scale=1e+02, C=1.00
+ Fold02: degree=1, scale=1e-03, C=2.00
- Fold02: degree=1, scale=1e-03, C=2.00
+ Fold02: degree=2, scale=1e-03, C=2.00
- Fold02: degree=2, scale=1e-03, C=2.00
+ Fold02: degree=3, scale=1e-03, C=2.00
- Fold02: degree=3, scale=1e-03, C=2.00
+ Fold02: degree=1, scale=1e-02, C=2.00

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- Fold02: degree=1, scale=1e-02, C=2.00
+ Fold02: degree=2, scale=1e-02, C=2.00
- Fold02: degree=2, scale=1e-02, C=2.00
+ Fold02: degree=3, scale=1e-02, C=2.00
- Fold02: degree=3, scale=1e-02, C=2.00
+ Fold02: degree=1, scale=1e-01, C=2.00
- Fold02: degree=1, scale=1e-01, C=2.00
+ Fold02: degree=2, scale=1e-01, C=2.00
- Fold02: degree=2, scale=1e-01, C=2.00
+ Fold02: degree=3, scale=1e-01, C=2.00
- Fold02: degree=3, scale=1e-01, C=2.00
+ Fold02: degree=1, scale=1e+00, C=2.00
- Fold02: degree=1, scale=1e+00, C=2.00
+ Fold02: degree=2, scale=1e+00, C=2.00
- Fold02: degree=2, scale=1e+00, C=2.00
+ Fold02: degree=3, scale=1e+00, C=2.00
- Fold02: degree=3, scale=1e+00, C=2.00
+ Fold02: degree=1, scale=1e+01, C=2.00
- Fold02: degree=1, scale=1e+01, C=2.00
+ Fold02: degree=2, scale=1e+01, C=2.00
- Fold02: degree=2, scale=1e+01, C=2.00
+ Fold02: degree=3, scale=1e+01, C=2.00
- Fold02: degree=3, scale=1e+01, C=2.00
+ Fold02: degree=1, scale=1e+02, C=2.00
- Fold02: degree=1, scale=1e+02, C=2.00
+ Fold02: degree=2, scale=1e+02, C=2.00
- Fold02: degree=2, scale=1e+02, C=2.00
+ Fold02: degree=3, scale=1e+02, C=2.00
- Fold02: degree=3, scale=1e+02, C=2.00
+ Fold02: degree=1, scale=1e-03, C=4.00
- Fold02: degree=1, scale=1e-03, C=4.00
+ Fold02: degree=2, scale=1e-03, C=4.00
- Fold02: degree=2, scale=1e-03, C=4.00
+ Fold02: degree=3, scale=1e-03, C=4.00
- Fold02: degree=3, scale=1e-03, C=4.00
+ Fold02: degree=1, scale=1e-02, C=4.00
- Fold02: degree=1, scale=1e-02, C=4.00
+ Fold02: degree=2, scale=1e-02, C=4.00
- Fold02: degree=2, scale=1e-02, C=4.00
+ Fold02: degree=3, scale=1e-02, C=4.00
- Fold02: degree=3, scale=1e-02, C=4.00
+ Fold02: degree=1, scale=1e-01, C=4.00
- Fold02: degree=1, scale=1e-01, C=4.00
+ Fold02: degree=2, scale=1e-01, C=4.00
- Fold02: degree=2, scale=1e-01, C=4.00
+ Fold02: degree=3, scale=1e-01, C=4.00
- Fold02: degree=3, scale=1e-01, C=4.00
+ Fold02: degree=1, scale=1e+00, C=4.00
- Fold02: degree=1, scale=1e+00, C=4.00
+ Fold02: degree=2, scale=1e+00, C=4.00
- Fold02: degree=2, scale=1e+00, C=4.00
+ Fold02: degree=3, scale=1e+00, C=4.00
- Fold02: degree=3, scale=1e+00, C=4.00
+ Fold02: degree=1, scale=1e+01, C=4.00

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- Fold02: degree=1, scale=1e+01, C=4.00
 + Fold02: degree=2, scale=1e+01, C=4.00
 - Fold02: degree=2, scale=1e+01, C=4.00
 + Fold02: degree=3, scale=1e+01, C=4.00
 - Fold02: degree=3, scale=1e+01, C=4.00
 + Fold02: degree=1, scale=1e+02, C=4.00
 - Fold02: degree=1, scale=1e+02, C=4.00
 + Fold02: degree=2, scale=1e+02, C=4.00
 - Fold02: degree=2, scale=1e+02, C=4.00
 + Fold02: degree=3, scale=1e+02, C=4.00
 - Fold02: degree=3, scale=1e+02, C=4.00
 + Fold02: degree=1, scale=1e-03, C=8.00
 - Fold02: degree=1, scale=1e-03, C=8.00
 + Fold02: degree=2, scale=1e-03, C=8.00
 - Fold02: degree=2, scale=1e-03, C=8.00
 + Fold02: degree=3, scale=1e-03, C=8.00
 - Fold02: degree=3, scale=1e-03, C=8.00
 + Fold02: degree=1, scale=1e-02, C=8.00
 - Fold02: degree=1, scale=1e-02, C=8.00
 + Fold02: degree=2, scale=1e-02, C=8.00
 - Fold02: degree=2, scale=1e-02, C=8.00
 + Fold02: degree=3, scale=1e-02, C=8.00
 - Fold02: degree=3, scale=1e-02, C=8.00
 + Fold02: degree=1, scale=1e-01, C=8.00
 - Fold02: degree=1, scale=1e-01, C=8.00
 + Fold02: degree=2, scale=1e-01, C=8.00
 - Fold02: degree=2, scale=1e-01, C=8.00
 + Fold02: degree=3, scale=1e-01, C=8.00
 - Fold02: degree=3, scale=1e-01, C=8.00
 + Fold02: degree=1, scale=1e+00, C=8.00
 - Fold02: degree=1, scale=1e+00, C=8.00
 + Fold02: degree=2, scale=1e+00, C=8.00
 - Fold02: degree=2, scale=1e+00, C=8.00
 + Fold02: degree=3, scale=1e+00, C=8.00
 - Fold02: degree=3, scale=1e+00, C=8.00
 + Fold02: degree=1, scale=1e+01, C=8.00
 - Fold02: degree=1, scale=1e+01, C=8.00
 + Fold02: degree=2, scale=1e+01, C=8.00
 - Fold02: degree=2, scale=1e+01, C=8.00
 + Fold02: degree=3, scale=1e+01, C=8.00
 - Fold02: degree=3, scale=1e+01, C=8.00
 + Fold02: degree=1, scale=1e+02, C=8.00
 - Fold02: degree=1, scale=1e+02, C=8.00
 + Fold02: degree=2, scale=1e+02, C=8.00
 - Fold02: degree=2, scale=1e+02, C=8.00
 + Fold02: degree=3, scale=1e+02, C=8.00
 - Fold02: degree=3, scale=1e+02, C=8.00
 + Fold03: degree=1, scale=1e-03, C=0.25
 - Fold03: degree=1, scale=1e-03, C=0.25
 + Fold03: degree=2, scale=1e-03, C=0.25
 - Fold03: degree=2, scale=1e-03, C=0.25
 + Fold03: degree=3, scale=1e-03, C=0.25
 - Fold03: degree=3, scale=1e-03, C=0.25
 + Fold03: degree=1, scale=1e-02, C=0.25

- Fold03: degree=1, scale=1e-02, C=0.25
 + Fold03: degree=2, scale=1e-02, C=0.25
 - Fold03: degree=2, scale=1e-02, C=0.25
 + Fold03: degree=3, scale=1e-02, C=0.25
 - Fold03: degree=3, scale=1e-02, C=0.25
 + Fold03: degree=1, scale=1e-01, C=0.25
 - Fold03: degree=1, scale=1e-01, C=0.25
 + Fold03: degree=2, scale=1e-01, C=0.25
 - Fold03: degree=2, scale=1e-01, C=0.25
 + Fold03: degree=3, scale=1e-01, C=0.25
 - Fold03: degree=3, scale=1e-01, C=0.25
 + Fold03: degree=1, scale=1e+00, C=0.25
 - Fold03: degree=1, scale=1e+00, C=0.25
 + Fold03: degree=2, scale=1e+00, C=0.25
 - Fold03: degree=2, scale=1e+00, C=0.25
 + Fold03: degree=3, scale=1e+00, C=0.25
 - Fold03: degree=3, scale=1e+00, C=0.25
 + Fold03: degree=1, scale=1e+01, C=0.25
 - Fold03: degree=1, scale=1e+01, C=0.25
 + Fold03: degree=2, scale=1e+01, C=0.25
 - Fold03: degree=2, scale=1e+01, C=0.25
 + Fold03: degree=3, scale=1e+01, C=0.25
 - Fold03: degree=3, scale=1e+01, C=0.25
 + Fold03: degree=1, scale=1e+02, C=0.25
 - Fold03: degree=1, scale=1e+02, C=0.25
 + Fold03: degree=2, scale=1e+02, C=0.25
 - Fold03: degree=2, scale=1e+02, C=0.25
 + Fold03: degree=3, scale=1e+02, C=0.25
 - Fold03: degree=3, scale=1e+02, C=0.25
 + Fold03: degree=1, scale=1e-03, C=0.50
 - Fold03: degree=1, scale=1e-03, C=0.50
 + Fold03: degree=2, scale=1e-03, C=0.50
 - Fold03: degree=2, scale=1e-03, C=0.50
 + Fold03: degree=3, scale=1e-03, C=0.50
 - Fold03: degree=3, scale=1e-03, C=0.50
 + Fold03: degree=1, scale=1e-02, C=0.50
 - Fold03: degree=1, scale=1e-02, C=0.50
 + Fold03: degree=2, scale=1e-02, C=0.50
 - Fold03: degree=2, scale=1e-02, C=0.50
 + Fold03: degree=3, scale=1e-02, C=0.50
 - Fold03: degree=3, scale=1e-02, C=0.50
 + Fold03: degree=1, scale=1e-01, C=0.50
 - Fold03: degree=1, scale=1e-01, C=0.50
 + Fold03: degree=2, scale=1e-01, C=0.50
 - Fold03: degree=2, scale=1e-01, C=0.50
 + Fold03: degree=3, scale=1e-01, C=0.50
 - Fold03: degree=3, scale=1e-01, C=0.50
 + Fold03: degree=1, scale=1e+00, C=0.50
 - Fold03: degree=1, scale=1e+00, C=0.50
 + Fold03: degree=2, scale=1e+00, C=0.50
 - Fold03: degree=2, scale=1e+00, C=0.50
 + Fold03: degree=3, scale=1e+00, C=0.50
 - Fold03: degree=3, scale=1e+00, C=0.50
 + Fold03: degree=1, scale=1e+01, C=0.50

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- Fold03: degree=1, scale=1e+01, C=0.50
+ Fold03: degree=2, scale=1e+01, C=0.50
- Fold03: degree=2, scale=1e+01, C=0.50
+ Fold03: degree=3, scale=1e+01, C=0.50
- Fold03: degree=3, scale=1e+01, C=0.50
+ Fold03: degree=1, scale=1e+02, C=0.50
- Fold03: degree=1, scale=1e+02, C=0.50
+ Fold03: degree=2, scale=1e+02, C=0.50
- Fold03: degree=2, scale=1e+02, C=0.50
+ Fold03: degree=3, scale=1e+02, C=0.50
- Fold03: degree=3, scale=1e+02, C=0.50
+ Fold03: degree=1, scale=1e-03, C=1.00
- Fold03: degree=1, scale=1e-03, C=1.00
+ Fold03: degree=2, scale=1e-03, C=1.00
- Fold03: degree=2, scale=1e-03, C=1.00
+ Fold03: degree=3, scale=1e-03, C=1.00
- Fold03: degree=3, scale=1e-03, C=1.00
+ Fold03: degree=1, scale=1e-02, C=1.00
- Fold03: degree=1, scale=1e-02, C=1.00
+ Fold03: degree=2, scale=1e-02, C=1.00
- Fold03: degree=2, scale=1e-02, C=1.00
+ Fold03: degree=3, scale=1e-02, C=1.00
- Fold03: degree=3, scale=1e-02, C=1.00
+ Fold03: degree=1, scale=1e-01, C=1.00
- Fold03: degree=1, scale=1e-01, C=1.00
+ Fold03: degree=2, scale=1e-01, C=1.00
- Fold03: degree=2, scale=1e-01, C=1.00
+ Fold03: degree=3, scale=1e-01, C=1.00
- Fold03: degree=3, scale=1e-01, C=1.00
+ Fold03: degree=1, scale=1e+00, C=1.00
- Fold03: degree=1, scale=1e+00, C=1.00
+ Fold03: degree=2, scale=1e+00, C=1.00
- Fold03: degree=2, scale=1e+00, C=1.00
+ Fold03: degree=3, scale=1e+00, C=1.00
- Fold03: degree=3, scale=1e+00, C=1.00
+ Fold03: degree=1, scale=1e+01, C=1.00
- Fold03: degree=1, scale=1e+01, C=1.00
+ Fold03: degree=2, scale=1e+01, C=1.00
- Fold03: degree=2, scale=1e+01, C=1.00
+ Fold03: degree=3, scale=1e+01, C=1.00
- Fold03: degree=3, scale=1e+01, C=1.00
+ Fold03: degree=1, scale=1e+02, C=1.00
- Fold03: degree=1, scale=1e+02, C=1.00
+ Fold03: degree=2, scale=1e+02, C=1.00
- Fold03: degree=2, scale=1e+02, C=1.00
+ Fold03: degree=3, scale=1e+02, C=1.00
- Fold03: degree=3, scale=1e+02, C=1.00
+ Fold03: degree=1, scale=1e-03, C=2.00
- Fold03: degree=1, scale=1e-03, C=2.00
+ Fold03: degree=2, scale=1e-03, C=2.00
- Fold03: degree=2, scale=1e-03, C=2.00
+ Fold03: degree=3, scale=1e-03, C=2.00
- Fold03: degree=3, scale=1e-03, C=2.00
+ Fold03: degree=1, scale=1e-02, C=2.00

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- Fold03: degree=1, scale=1e-02, C=2.00
+ Fold03: degree=2, scale=1e-02, C=2.00
- Fold03: degree=2, scale=1e-02, C=2.00
+ Fold03: degree=3, scale=1e-02, C=2.00
- Fold03: degree=3, scale=1e-02, C=2.00
+ Fold03: degree=1, scale=1e-01, C=2.00
- Fold03: degree=1, scale=1e-01, C=2.00
+ Fold03: degree=2, scale=1e-01, C=2.00
- Fold03: degree=2, scale=1e-01, C=2.00
+ Fold03: degree=3, scale=1e-01, C=2.00
- Fold03: degree=3, scale=1e-01, C=2.00
+ Fold03: degree=1, scale=1e+00, C=2.00
- Fold03: degree=1, scale=1e+00, C=2.00
+ Fold03: degree=2, scale=1e+00, C=2.00
- Fold03: degree=2, scale=1e+00, C=2.00
+ Fold03: degree=3, scale=1e+00, C=2.00
- Fold03: degree=3, scale=1e+00, C=2.00
+ Fold03: degree=1, scale=1e+01, C=2.00
- Fold03: degree=1, scale=1e+01, C=2.00
+ Fold03: degree=2, scale=1e+01, C=2.00
- Fold03: degree=2, scale=1e+01, C=2.00
+ Fold03: degree=3, scale=1e+01, C=2.00
- Fold03: degree=3, scale=1e+01, C=2.00
+ Fold03: degree=1, scale=1e+02, C=2.00
- Fold03: degree=1, scale=1e+02, C=2.00
+ Fold03: degree=2, scale=1e+02, C=2.00
- Fold03: degree=2, scale=1e+02, C=2.00
+ Fold03: degree=3, scale=1e+02, C=2.00
- Fold03: degree=3, scale=1e+02, C=2.00
+ Fold03: degree=1, scale=1e-03, C=4.00
- Fold03: degree=1, scale=1e-03, C=4.00
+ Fold03: degree=2, scale=1e-03, C=4.00
- Fold03: degree=2, scale=1e-03, C=4.00
+ Fold03: degree=3, scale=1e-03, C=4.00
- Fold03: degree=3, scale=1e-03, C=4.00
+ Fold03: degree=1, scale=1e-02, C=4.00
- Fold03: degree=1, scale=1e-02, C=4.00
+ Fold03: degree=2, scale=1e-02, C=4.00
- Fold03: degree=2, scale=1e-02, C=4.00
+ Fold03: degree=3, scale=1e-02, C=4.00
- Fold03: degree=3, scale=1e-02, C=4.00
+ Fold03: degree=1, scale=1e-01, C=4.00
- Fold03: degree=1, scale=1e-01, C=4.00
+ Fold03: degree=2, scale=1e-01, C=4.00
- Fold03: degree=2, scale=1e-01, C=4.00
+ Fold03: degree=3, scale=1e-01, C=4.00
- Fold03: degree=3, scale=1e-01, C=4.00
+ Fold03: degree=1, scale=1e+00, C=4.00
- Fold03: degree=1, scale=1e+00, C=4.00
+ Fold03: degree=2, scale=1e+00, C=4.00
- Fold03: degree=2, scale=1e+00, C=4.00
+ Fold03: degree=3, scale=1e+00, C=4.00
- Fold03: degree=3, scale=1e+00, C=4.00
+ Fold03: degree=1, scale=1e+01, C=4.00

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- Fold03: degree=1, scale=1e+01, C=4.00
+ Fold03: degree=2, scale=1e+01, C=4.00
- Fold03: degree=2, scale=1e+01, C=4.00
+ Fold03: degree=3, scale=1e+01, C=4.00
- Fold03: degree=3, scale=1e+01, C=4.00
+ Fold03: degree=1, scale=1e+02, C=4.00
- Fold03: degree=1, scale=1e+02, C=4.00
+ Fold03: degree=2, scale=1e+02, C=4.00
- Fold03: degree=2, scale=1e+02, C=4.00
+ Fold03: degree=3, scale=1e+02, C=4.00
- Fold03: degree=3, scale=1e+02, C=4.00
+ Fold03: degree=1, scale=1e-03, C=8.00
- Fold03: degree=1, scale=1e-03, C=8.00
+ Fold03: degree=2, scale=1e-03, C=8.00
- Fold03: degree=2, scale=1e-03, C=8.00
+ Fold03: degree=3, scale=1e-03, C=8.00
- Fold03: degree=3, scale=1e-03, C=8.00
+ Fold03: degree=1, scale=1e-02, C=8.00
- Fold03: degree=1, scale=1e-02, C=8.00
+ Fold03: degree=2, scale=1e-02, C=8.00
- Fold03: degree=2, scale=1e-02, C=8.00
+ Fold03: degree=3, scale=1e-02, C=8.00
- Fold03: degree=3, scale=1e-02, C=8.00
+ Fold03: degree=1, scale=1e-01, C=8.00
- Fold03: degree=1, scale=1e-01, C=8.00
+ Fold03: degree=2, scale=1e-01, C=8.00
- Fold03: degree=2, scale=1e-01, C=8.00
+ Fold03: degree=3, scale=1e-01, C=8.00
- Fold03: degree=3, scale=1e-01, C=8.00
+ Fold03: degree=1, scale=1e+00, C=8.00
- Fold03: degree=1, scale=1e+00, C=8.00
+ Fold03: degree=2, scale=1e+00, C=8.00
- Fold03: degree=2, scale=1e+00, C=8.00
+ Fold03: degree=3, scale=1e+00, C=8.00
- Fold03: degree=3, scale=1e+00, C=8.00
+ Fold03: degree=1, scale=1e+01, C=8.00
- Fold03: degree=1, scale=1e+01, C=8.00
+ Fold03: degree=2, scale=1e+01, C=8.00
- Fold03: degree=2, scale=1e+01, C=8.00
+ Fold03: degree=3, scale=1e+01, C=8.00
- Fold03: degree=3, scale=1e+01, C=8.00
+ Fold03: degree=1, scale=1e+02, C=8.00
- Fold03: degree=1, scale=1e+02, C=8.00
+ Fold03: degree=2, scale=1e+02, C=8.00
- Fold03: degree=2, scale=1e+02, C=8.00
+ Fold03: degree=3, scale=1e+02, C=8.00
- Fold03: degree=3, scale=1e+02, C=8.00
+ Fold04: degree=1, scale=1e-03, C=0.25
- Fold04: degree=1, scale=1e-03, C=0.25
+ Fold04: degree=2, scale=1e-03, C=0.25
- Fold04: degree=2, scale=1e-03, C=0.25
+ Fold04: degree=3, scale=1e-03, C=0.25
- Fold04: degree=3, scale=1e-03, C=0.25
+ Fold04: degree=1, scale=1e-02, C=0.25

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- Fold04: degree=1, scale=1e-02, C=0.25
 + Fold04: degree=2, scale=1e-02, C=0.25
 - Fold04: degree=2, scale=1e-02, C=0.25
 + Fold04: degree=3, scale=1e-02, C=0.25
 - Fold04: degree=3, scale=1e-02, C=0.25
 + Fold04: degree=1, scale=1e-01, C=0.25
 - Fold04: degree=1, scale=1e-01, C=0.25
 + Fold04: degree=2, scale=1e-01, C=0.25
 - Fold04: degree=2, scale=1e-01, C=0.25
 + Fold04: degree=3, scale=1e-01, C=0.25
 - Fold04: degree=3, scale=1e-01, C=0.25
 + Fold04: degree=1, scale=1e+00, C=0.25
 - Fold04: degree=1, scale=1e+00, C=0.25
 + Fold04: degree=2, scale=1e+00, C=0.25
 - Fold04: degree=2, scale=1e+00, C=0.25
 + Fold04: degree=3, scale=1e+00, C=0.25
 - Fold04: degree=3, scale=1e+00, C=0.25
 + Fold04: degree=1, scale=1e+01, C=0.25
 - Fold04: degree=1, scale=1e+01, C=0.25
 + Fold04: degree=2, scale=1e+01, C=0.25
 - Fold04: degree=2, scale=1e+01, C=0.25
 + Fold04: degree=3, scale=1e+01, C=0.25
 - Fold04: degree=3, scale=1e+01, C=0.25
 + Fold04: degree=1, scale=1e+02, C=0.25
 - Fold04: degree=1, scale=1e+02, C=0.25
 + Fold04: degree=2, scale=1e+02, C=0.25
 - Fold04: degree=2, scale=1e+02, C=0.25
 + Fold04: degree=3, scale=1e+02, C=0.25
 - Fold04: degree=3, scale=1e+02, C=0.25
 + Fold04: degree=1, scale=1e-03, C=0.50
 - Fold04: degree=1, scale=1e-03, C=0.50
 + Fold04: degree=2, scale=1e-03, C=0.50
 - Fold04: degree=2, scale=1e-03, C=0.50
 + Fold04: degree=3, scale=1e-03, C=0.50
 - Fold04: degree=3, scale=1e-03, C=0.50
 + Fold04: degree=1, scale=1e-02, C=0.50
 - Fold04: degree=1, scale=1e-02, C=0.50
 + Fold04: degree=2, scale=1e-02, C=0.50
 - Fold04: degree=2, scale=1e-02, C=0.50
 + Fold04: degree=3, scale=1e-02, C=0.50
 - Fold04: degree=3, scale=1e-02, C=0.50
 + Fold04: degree=1, scale=1e-01, C=0.50
 - Fold04: degree=1, scale=1e-01, C=0.50
 + Fold04: degree=2, scale=1e-01, C=0.50
 - Fold04: degree=2, scale=1e-01, C=0.50
 + Fold04: degree=3, scale=1e-01, C=0.50
 - Fold04: degree=3, scale=1e-01, C=0.50
 + Fold04: degree=1, scale=1e+00, C=0.50
 - Fold04: degree=1, scale=1e+00, C=0.50
 + Fold04: degree=2, scale=1e+00, C=0.50
 - Fold04: degree=2, scale=1e+00, C=0.50
 + Fold04: degree=3, scale=1e+00, C=0.50
 - Fold04: degree=3, scale=1e+00, C=0.50
 + Fold04: degree=1, scale=1e+01, C=0.50

- Fold04: degree=1, scale=1e+01, C=0.50
 + Fold04: degree=2, scale=1e+01, C=0.50
 - Fold04: degree=2, scale=1e+01, C=0.50
 + Fold04: degree=3, scale=1e+01, C=0.50
 - Fold04: degree=3, scale=1e+01, C=0.50
 + Fold04: degree=1, scale=1e+02, C=0.50
 - Fold04: degree=1, scale=1e+02, C=0.50
 + Fold04: degree=2, scale=1e+02, C=0.50
 - Fold04: degree=2, scale=1e+02, C=0.50
 + Fold04: degree=3, scale=1e+02, C=0.50
 - Fold04: degree=3, scale=1e+02, C=0.50
 + Fold04: degree=1, scale=1e-03, C=1.00
 - Fold04: degree=1, scale=1e-03, C=1.00
 + Fold04: degree=2, scale=1e-03, C=1.00
 - Fold04: degree=2, scale=1e-03, C=1.00
 + Fold04: degree=3, scale=1e-03, C=1.00
 - Fold04: degree=3, scale=1e-03, C=1.00
 + Fold04: degree=1, scale=1e-02, C=1.00
 - Fold04: degree=1, scale=1e-02, C=1.00
 + Fold04: degree=2, scale=1e-02, C=1.00
 - Fold04: degree=2, scale=1e-02, C=1.00
 + Fold04: degree=3, scale=1e-02, C=1.00
 - Fold04: degree=3, scale=1e-02, C=1.00
 + Fold04: degree=1, scale=1e-01, C=1.00
 - Fold04: degree=1, scale=1e-01, C=1.00
 + Fold04: degree=2, scale=1e-01, C=1.00
 - Fold04: degree=2, scale=1e-01, C=1.00
 + Fold04: degree=3, scale=1e-01, C=1.00
 - Fold04: degree=3, scale=1e-01, C=1.00
 + Fold04: degree=1, scale=1e+00, C=1.00
 - Fold04: degree=1, scale=1e+00, C=1.00
 + Fold04: degree=2, scale=1e+00, C=1.00
 - Fold04: degree=2, scale=1e+00, C=1.00
 + Fold04: degree=3, scale=1e+00, C=1.00
 - Fold04: degree=3, scale=1e+00, C=1.00
 + Fold04: degree=1, scale=1e+01, C=1.00
 - Fold04: degree=1, scale=1e+01, C=1.00
 + Fold04: degree=2, scale=1e+01, C=1.00
 - Fold04: degree=2, scale=1e+01, C=1.00
 + Fold04: degree=3, scale=1e+01, C=1.00
 - Fold04: degree=3, scale=1e+01, C=1.00
 + Fold04: degree=1, scale=1e+02, C=1.00
 - Fold04: degree=1, scale=1e+02, C=1.00
 + Fold04: degree=2, scale=1e+02, C=1.00
 - Fold04: degree=2, scale=1e+02, C=1.00
 + Fold04: degree=3, scale=1e+02, C=1.00
 - Fold04: degree=3, scale=1e+02, C=1.00
 + Fold04: degree=1, scale=1e-03, C=2.00
 - Fold04: degree=1, scale=1e-03, C=2.00
 + Fold04: degree=2, scale=1e-03, C=2.00
 - Fold04: degree=2, scale=1e-03, C=2.00
 + Fold04: degree=3, scale=1e-03, C=2.00
 - Fold04: degree=3, scale=1e-03, C=2.00
 + Fold04: degree=1, scale=1e-02, C=2.00

- Fold04: degree=1, scale=1e-02, C=2.00
 + Fold04: degree=2, scale=1e-02, C=2.00
 - Fold04: degree=2, scale=1e-02, C=2.00
 + Fold04: degree=3, scale=1e-02, C=2.00
 - Fold04: degree=3, scale=1e-02, C=2.00
 + Fold04: degree=1, scale=1e-01, C=2.00
 - Fold04: degree=1, scale=1e-01, C=2.00
 + Fold04: degree=2, scale=1e-01, C=2.00
 - Fold04: degree=2, scale=1e-01, C=2.00
 + Fold04: degree=3, scale=1e-01, C=2.00
 - Fold04: degree=3, scale=1e-01, C=2.00
 + Fold04: degree=1, scale=1e+00, C=2.00
 - Fold04: degree=1, scale=1e+00, C=2.00
 + Fold04: degree=2, scale=1e+00, C=2.00
 - Fold04: degree=2, scale=1e+00, C=2.00
 + Fold04: degree=3, scale=1e+00, C=2.00
 - Fold04: degree=3, scale=1e+00, C=2.00
 + Fold04: degree=1, scale=1e+01, C=2.00
 - Fold04: degree=1, scale=1e+01, C=2.00
 + Fold04: degree=2, scale=1e+01, C=2.00
 - Fold04: degree=2, scale=1e+01, C=2.00
 + Fold04: degree=3, scale=1e+01, C=2.00
 - Fold04: degree=3, scale=1e+01, C=2.00
 + Fold04: degree=1, scale=1e+02, C=2.00
 - Fold04: degree=1, scale=1e+02, C=2.00
 + Fold04: degree=2, scale=1e+02, C=2.00
 - Fold04: degree=2, scale=1e+02, C=2.00
 + Fold04: degree=3, scale=1e+02, C=2.00
 - Fold04: degree=3, scale=1e+02, C=2.00
 + Fold04: degree=1, scale=1e-03, C=4.00
 - Fold04: degree=1, scale=1e-03, C=4.00
 + Fold04: degree=2, scale=1e-03, C=4.00
 - Fold04: degree=2, scale=1e-03, C=4.00
 + Fold04: degree=3, scale=1e-03, C=4.00
 - Fold04: degree=3, scale=1e-03, C=4.00
 + Fold04: degree=1, scale=1e-02, C=4.00
 - Fold04: degree=1, scale=1e-02, C=4.00
 + Fold04: degree=2, scale=1e-02, C=4.00
 - Fold04: degree=2, scale=1e-02, C=4.00
 + Fold04: degree=3, scale=1e-02, C=4.00
 - Fold04: degree=3, scale=1e-02, C=4.00
 + Fold04: degree=1, scale=1e-01, C=4.00
 - Fold04: degree=1, scale=1e-01, C=4.00
 + Fold04: degree=2, scale=1e-01, C=4.00
 - Fold04: degree=2, scale=1e-01, C=4.00
 + Fold04: degree=3, scale=1e-01, C=4.00
 - Fold04: degree=3, scale=1e-01, C=4.00
 + Fold04: degree=1, scale=1e+00, C=4.00
 - Fold04: degree=1, scale=1e+00, C=4.00
 + Fold04: degree=2, scale=1e+00, C=4.00
 - Fold04: degree=2, scale=1e+00, C=4.00
 + Fold04: degree=3, scale=1e+00, C=4.00
 - Fold04: degree=3, scale=1e+00, C=4.00
 + Fold04: degree=1, scale=1e+01, C=4.00

- Fold04: degree=1, scale=1e+01, C=4.00
 + Fold04: degree=2, scale=1e+01, C=4.00
 - Fold04: degree=2, scale=1e+01, C=4.00
 + Fold04: degree=3, scale=1e+01, C=4.00
 - Fold04: degree=3, scale=1e+01, C=4.00
 + Fold04: degree=1, scale=1e+02, C=4.00
 - Fold04: degree=1, scale=1e+02, C=4.00
 + Fold04: degree=2, scale=1e+02, C=4.00
 - Fold04: degree=2, scale=1e+02, C=4.00
 + Fold04: degree=3, scale=1e+02, C=4.00
 - Fold04: degree=3, scale=1e+02, C=4.00
 + Fold04: degree=1, scale=1e-03, C=8.00
 - Fold04: degree=1, scale=1e-03, C=8.00
 + Fold04: degree=2, scale=1e-03, C=8.00
 - Fold04: degree=2, scale=1e-03, C=8.00
 + Fold04: degree=3, scale=1e-03, C=8.00
 - Fold04: degree=3, scale=1e-03, C=8.00
 + Fold04: degree=1, scale=1e-02, C=8.00
 - Fold04: degree=1, scale=1e-02, C=8.00
 + Fold04: degree=2, scale=1e-02, C=8.00
 - Fold04: degree=2, scale=1e-02, C=8.00
 + Fold04: degree=3, scale=1e-02, C=8.00
 - Fold04: degree=3, scale=1e-02, C=8.00
 + Fold04: degree=1, scale=1e-01, C=8.00
 - Fold04: degree=1, scale=1e-01, C=8.00
 + Fold04: degree=2, scale=1e-01, C=8.00
 - Fold04: degree=2, scale=1e-01, C=8.00
 + Fold04: degree=3, scale=1e-01, C=8.00
 - Fold04: degree=3, scale=1e-01, C=8.00
 + Fold04: degree=1, scale=1e+00, C=8.00
 - Fold04: degree=1, scale=1e+00, C=8.00
 + Fold04: degree=2, scale=1e+00, C=8.00
 - Fold04: degree=2, scale=1e+00, C=8.00
 + Fold04: degree=3, scale=1e+00, C=8.00
 - Fold04: degree=3, scale=1e+00, C=8.00
 + Fold04: degree=1, scale=1e+01, C=8.00
 - Fold04: degree=1, scale=1e+01, C=8.00
 + Fold04: degree=2, scale=1e+01, C=8.00
 - Fold04: degree=2, scale=1e+01, C=8.00
 + Fold04: degree=3, scale=1e+01, C=8.00
 - Fold04: degree=3, scale=1e+01, C=8.00
 + Fold04: degree=1, scale=1e+02, C=8.00
 - Fold04: degree=1, scale=1e+02, C=8.00
 + Fold04: degree=2, scale=1e+02, C=8.00
 - Fold04: degree=2, scale=1e+02, C=8.00
 + Fold04: degree=3, scale=1e+02, C=8.00
 - Fold04: degree=3, scale=1e+02, C=8.00
 + Fold05: degree=1, scale=1e-03, C=0.25
 - Fold05: degree=1, scale=1e-03, C=0.25
 + Fold05: degree=2, scale=1e-03, C=0.25
 - Fold05: degree=2, scale=1e-03, C=0.25
 + Fold05: degree=3, scale=1e-03, C=0.25
 - Fold05: degree=3, scale=1e-03, C=0.25
 + Fold05: degree=1, scale=1e-02, C=0.25

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- Fold05: degree=1, scale=1e-02, C=0.25
+ Fold05: degree=2, scale=1e-02, C=0.25
- Fold05: degree=2, scale=1e-02, C=0.25
+ Fold05: degree=3, scale=1e-02, C=0.25
- Fold05: degree=3, scale=1e-02, C=0.25
+ Fold05: degree=1, scale=1e-01, C=0.25
- Fold05: degree=1, scale=1e-01, C=0.25
+ Fold05: degree=2, scale=1e-01, C=0.25
- Fold05: degree=2, scale=1e-01, C=0.25
+ Fold05: degree=3, scale=1e-01, C=0.25
- Fold05: degree=3, scale=1e-01, C=0.25
+ Fold05: degree=1, scale=1e+00, C=0.25
- Fold05: degree=1, scale=1e+00, C=0.25
+ Fold05: degree=2, scale=1e+00, C=0.25
- Fold05: degree=2, scale=1e+00, C=0.25
+ Fold05: degree=3, scale=1e+00, C=0.25
- Fold05: degree=3, scale=1e+00, C=0.25
+ Fold05: degree=1, scale=1e+01, C=0.25
- Fold05: degree=1, scale=1e+01, C=0.25
+ Fold05: degree=2, scale=1e+01, C=0.25
- Fold05: degree=2, scale=1e+01, C=0.25
+ Fold05: degree=3, scale=1e+01, C=0.25
- Fold05: degree=3, scale=1e+01, C=0.25
+ Fold05: degree=1, scale=1e+02, C=0.25
- Fold05: degree=1, scale=1e+02, C=0.25
+ Fold05: degree=2, scale=1e+02, C=0.25
- Fold05: degree=2, scale=1e+02, C=0.25
+ Fold05: degree=3, scale=1e+02, C=0.25
- Fold05: degree=3, scale=1e+02, C=0.25
+ Fold05: degree=1, scale=1e-03, C=0.50
- Fold05: degree=1, scale=1e-03, C=0.50
+ Fold05: degree=2, scale=1e-03, C=0.50
- Fold05: degree=2, scale=1e-03, C=0.50
+ Fold05: degree=3, scale=1e-03, C=0.50
- Fold05: degree=3, scale=1e-03, C=0.50
+ Fold05: degree=1, scale=1e-02, C=0.50
- Fold05: degree=1, scale=1e-02, C=0.50
+ Fold05: degree=2, scale=1e-02, C=0.50
- Fold05: degree=2, scale=1e-02, C=0.50
+ Fold05: degree=3, scale=1e-02, C=0.50
- Fold05: degree=3, scale=1e-02, C=0.50
+ Fold05: degree=1, scale=1e-01, C=0.50
- Fold05: degree=1, scale=1e-01, C=0.50
+ Fold05: degree=2, scale=1e-01, C=0.50
- Fold05: degree=2, scale=1e-01, C=0.50
+ Fold05: degree=3, scale=1e-01, C=0.50
- Fold05: degree=3, scale=1e-01, C=0.50
+ Fold05: degree=1, scale=1e+00, C=0.50
- Fold05: degree=1, scale=1e+00, C=0.50
+ Fold05: degree=2, scale=1e+00, C=0.50
- Fold05: degree=2, scale=1e+00, C=0.50
+ Fold05: degree=3, scale=1e+00, C=0.50
- Fold05: degree=3, scale=1e+00, C=0.50
+ Fold05: degree=1, scale=1e+01, C=0.50

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- Fold05: degree=1, scale=1e+01, C=0.50
+ Fold05: degree=2, scale=1e+01, C=0.50
- Fold05: degree=2, scale=1e+01, C=0.50
+ Fold05: degree=3, scale=1e+01, C=0.50
- Fold05: degree=3, scale=1e+01, C=0.50
+ Fold05: degree=1, scale=1e+02, C=0.50
- Fold05: degree=1, scale=1e+02, C=0.50
+ Fold05: degree=2, scale=1e+02, C=0.50
- Fold05: degree=2, scale=1e+02, C=0.50
+ Fold05: degree=3, scale=1e+02, C=0.50
- Fold05: degree=3, scale=1e+02, C=0.50
+ Fold05: degree=1, scale=1e-03, C=1.00
- Fold05: degree=1, scale=1e-03, C=1.00
+ Fold05: degree=2, scale=1e-03, C=1.00
- Fold05: degree=2, scale=1e-03, C=1.00
+ Fold05: degree=3, scale=1e-03, C=1.00
- Fold05: degree=3, scale=1e-03, C=1.00
+ Fold05: degree=1, scale=1e-02, C=1.00
- Fold05: degree=1, scale=1e-02, C=1.00
+ Fold05: degree=2, scale=1e-02, C=1.00
- Fold05: degree=2, scale=1e-02, C=1.00
+ Fold05: degree=3, scale=1e-02, C=1.00
- Fold05: degree=3, scale=1e-02, C=1.00
+ Fold05: degree=1, scale=1e-01, C=1.00
- Fold05: degree=1, scale=1e-01, C=1.00
+ Fold05: degree=2, scale=1e-01, C=1.00
- Fold05: degree=2, scale=1e-01, C=1.00
+ Fold05: degree=3, scale=1e-01, C=1.00
- Fold05: degree=3, scale=1e-01, C=1.00
+ Fold05: degree=1, scale=1e+00, C=1.00
- Fold05: degree=1, scale=1e+00, C=1.00
+ Fold05: degree=2, scale=1e+00, C=1.00
- Fold05: degree=2, scale=1e+00, C=1.00
+ Fold05: degree=3, scale=1e+00, C=1.00
- Fold05: degree=3, scale=1e+00, C=1.00
+ Fold05: degree=1, scale=1e+01, C=1.00
- Fold05: degree=1, scale=1e+01, C=1.00
+ Fold05: degree=2, scale=1e+01, C=1.00
- Fold05: degree=2, scale=1e+01, C=1.00
+ Fold05: degree=3, scale=1e+01, C=1.00
- Fold05: degree=3, scale=1e+01, C=1.00
+ Fold05: degree=1, scale=1e+02, C=1.00
- Fold05: degree=1, scale=1e+02, C=1.00
+ Fold05: degree=2, scale=1e+02, C=1.00
- Fold05: degree=2, scale=1e+02, C=1.00
+ Fold05: degree=3, scale=1e+02, C=1.00
- Fold05: degree=3, scale=1e+02, C=1.00
+ Fold05: degree=1, scale=1e-03, C=2.00
- Fold05: degree=1, scale=1e-03, C=2.00
+ Fold05: degree=2, scale=1e-03, C=2.00
- Fold05: degree=2, scale=1e-03, C=2.00
+ Fold05: degree=3, scale=1e-03, C=2.00
- Fold05: degree=3, scale=1e-03, C=2.00
+ Fold05: degree=1, scale=1e-02, C=2.00

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- Fold05: degree=1, scale=1e-02, C=2.00
+ Fold05: degree=2, scale=1e-02, C=2.00
- Fold05: degree=2, scale=1e-02, C=2.00
+ Fold05: degree=3, scale=1e-02, C=2.00
- Fold05: degree=3, scale=1e-02, C=2.00
+ Fold05: degree=1, scale=1e-01, C=2.00
- Fold05: degree=1, scale=1e-01, C=2.00
+ Fold05: degree=2, scale=1e-01, C=2.00
- Fold05: degree=2, scale=1e-01, C=2.00
+ Fold05: degree=3, scale=1e-01, C=2.00
- Fold05: degree=3, scale=1e-01, C=2.00
+ Fold05: degree=1, scale=1e+00, C=2.00
- Fold05: degree=1, scale=1e+00, C=2.00
+ Fold05: degree=2, scale=1e+00, C=2.00
- Fold05: degree=2, scale=1e+00, C=2.00
+ Fold05: degree=3, scale=1e+00, C=2.00
- Fold05: degree=3, scale=1e+00, C=2.00
+ Fold05: degree=1, scale=1e+01, C=2.00
- Fold05: degree=1, scale=1e+01, C=2.00
+ Fold05: degree=2, scale=1e+01, C=2.00
- Fold05: degree=2, scale=1e+01, C=2.00
+ Fold05: degree=3, scale=1e+01, C=2.00
- Fold05: degree=3, scale=1e+01, C=2.00
+ Fold05: degree=1, scale=1e+02, C=2.00
- Fold05: degree=1, scale=1e+02, C=2.00
+ Fold05: degree=2, scale=1e+02, C=2.00
- Fold05: degree=2, scale=1e+02, C=2.00
+ Fold05: degree=3, scale=1e+02, C=2.00
- Fold05: degree=3, scale=1e+02, C=2.00
+ Fold05: degree=1, scale=1e-03, C=4.00
- Fold05: degree=1, scale=1e-03, C=4.00
+ Fold05: degree=2, scale=1e-03, C=4.00
- Fold05: degree=2, scale=1e-03, C=4.00
+ Fold05: degree=3, scale=1e-03, C=4.00
- Fold05: degree=3, scale=1e-03, C=4.00
+ Fold05: degree=1, scale=1e-02, C=4.00
- Fold05: degree=1, scale=1e-02, C=4.00
+ Fold05: degree=2, scale=1e-02, C=4.00
- Fold05: degree=2, scale=1e-02, C=4.00
+ Fold05: degree=3, scale=1e-02, C=4.00
- Fold05: degree=3, scale=1e-02, C=4.00
+ Fold05: degree=1, scale=1e-01, C=4.00
- Fold05: degree=1, scale=1e-01, C=4.00
+ Fold05: degree=2, scale=1e-01, C=4.00
- Fold05: degree=2, scale=1e-01, C=4.00
+ Fold05: degree=3, scale=1e-01, C=4.00
- Fold05: degree=3, scale=1e-01, C=4.00
+ Fold05: degree=1, scale=1e+00, C=4.00
- Fold05: degree=1, scale=1e+00, C=4.00
+ Fold05: degree=2, scale=1e+00, C=4.00
- Fold05: degree=2, scale=1e+00, C=4.00
+ Fold05: degree=3, scale=1e+00, C=4.00
- Fold05: degree=3, scale=1e+00, C=4.00
+ Fold05: degree=1, scale=1e+01, C=4.00

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- Fold05: degree=1, scale=1e+01, C=4.00
+ Fold05: degree=2, scale=1e+01, C=4.00
- Fold05: degree=2, scale=1e+01, C=4.00
+ Fold05: degree=3, scale=1e+01, C=4.00
- Fold05: degree=3, scale=1e+01, C=4.00
+ Fold05: degree=1, scale=1e+02, C=4.00
- Fold05: degree=1, scale=1e+02, C=4.00
+ Fold05: degree=2, scale=1e+02, C=4.00
- Fold05: degree=2, scale=1e+02, C=4.00
+ Fold05: degree=3, scale=1e+02, C=4.00
- Fold05: degree=3, scale=1e+02, C=4.00
+ Fold05: degree=1, scale=1e-03, C=8.00
- Fold05: degree=1, scale=1e-03, C=8.00
+ Fold05: degree=2, scale=1e-03, C=8.00
- Fold05: degree=2, scale=1e-03, C=8.00
+ Fold05: degree=3, scale=1e-03, C=8.00
- Fold05: degree=3, scale=1e-03, C=8.00
+ Fold05: degree=1, scale=1e-02, C=8.00
- Fold05: degree=1, scale=1e-02, C=8.00
+ Fold05: degree=2, scale=1e-02, C=8.00
- Fold05: degree=2, scale=1e-02, C=8.00
+ Fold05: degree=3, scale=1e-02, C=8.00
- Fold05: degree=3, scale=1e-02, C=8.00
+ Fold05: degree=1, scale=1e-01, C=8.00
- Fold05: degree=1, scale=1e-01, C=8.00
+ Fold05: degree=2, scale=1e-01, C=8.00
- Fold05: degree=2, scale=1e-01, C=8.00
+ Fold05: degree=3, scale=1e-01, C=8.00
- Fold05: degree=3, scale=1e-01, C=8.00
+ Fold05: degree=1, scale=1e+00, C=8.00
- Fold05: degree=1, scale=1e+00, C=8.00
+ Fold05: degree=2, scale=1e+00, C=8.00
- Fold05: degree=2, scale=1e+00, C=8.00
+ Fold05: degree=3, scale=1e+00, C=8.00
- Fold05: degree=3, scale=1e+00, C=8.00
+ Fold05: degree=1, scale=1e+01, C=8.00
- Fold05: degree=1, scale=1e+01, C=8.00
+ Fold05: degree=2, scale=1e+01, C=8.00
- Fold05: degree=2, scale=1e+01, C=8.00
+ Fold05: degree=3, scale=1e+01, C=8.00
- Fold05: degree=3, scale=1e+01, C=8.00
+ Fold05: degree=1, scale=1e+02, C=8.00
- Fold05: degree=1, scale=1e+02, C=8.00
+ Fold05: degree=2, scale=1e+02, C=8.00
- Fold05: degree=2, scale=1e+02, C=8.00
+ Fold05: degree=3, scale=1e+02, C=8.00
- Fold05: degree=3, scale=1e+02, C=8.00
+ Fold06: degree=1, scale=1e-03, C=0.25
- Fold06: degree=1, scale=1e-03, C=0.25
+ Fold06: degree=2, scale=1e-03, C=0.25
- Fold06: degree=2, scale=1e-03, C=0.25
+ Fold06: degree=3, scale=1e-03, C=0.25
- Fold06: degree=3, scale=1e-03, C=0.25
+ Fold06: degree=1, scale=1e-02, C=0.25

```

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- Fold06: degree=1, scale=1e-02, C=0.25
+ Fold06: degree=2, scale=1e-02, C=0.25
- Fold06: degree=2, scale=1e-02, C=0.25
+ Fold06: degree=3, scale=1e-02, C=0.25
- Fold06: degree=3, scale=1e-02, C=0.25
+ Fold06: degree=1, scale=1e-01, C=0.25
- Fold06: degree=1, scale=1e-01, C=0.25
+ Fold06: degree=2, scale=1e-01, C=0.25
- Fold06: degree=2, scale=1e-01, C=0.25
+ Fold06: degree=3, scale=1e-01, C=0.25
- Fold06: degree=3, scale=1e-01, C=0.25
+ Fold06: degree=1, scale=1e+00, C=0.25
- Fold06: degree=1, scale=1e+00, C=0.25
+ Fold06: degree=2, scale=1e+00, C=0.25
- Fold06: degree=2, scale=1e+00, C=0.25
+ Fold06: degree=3, scale=1e+00, C=0.25
- Fold06: degree=3, scale=1e+00, C=0.25
+ Fold06: degree=1, scale=1e+01, C=0.25
- Fold06: degree=1, scale=1e+01, C=0.25
+ Fold06: degree=2, scale=1e+01, C=0.25
- Fold06: degree=2, scale=1e+01, C=0.25
+ Fold06: degree=3, scale=1e+01, C=0.25
- Fold06: degree=3, scale=1e+01, C=0.25
+ Fold06: degree=1, scale=1e+02, C=0.25
- Fold06: degree=1, scale=1e+02, C=0.25
+ Fold06: degree=2, scale=1e+02, C=0.25
- Fold06: degree=2, scale=1e+02, C=0.25
+ Fold06: degree=3, scale=1e+02, C=0.25
- Fold06: degree=3, scale=1e+02, C=0.25
+ Fold06: degree=1, scale=1e-03, C=0.50
- Fold06: degree=1, scale=1e-03, C=0.50
+ Fold06: degree=2, scale=1e-03, C=0.50
- Fold06: degree=2, scale=1e-03, C=0.50
+ Fold06: degree=3, scale=1e-03, C=0.50
- Fold06: degree=3, scale=1e-03, C=0.50
+ Fold06: degree=1, scale=1e-02, C=0.50
- Fold06: degree=1, scale=1e-02, C=0.50
+ Fold06: degree=2, scale=1e-02, C=0.50
- Fold06: degree=2, scale=1e-02, C=0.50
+ Fold06: degree=3, scale=1e-02, C=0.50
- Fold06: degree=3, scale=1e-02, C=0.50
+ Fold06: degree=1, scale=1e-01, C=0.50
- Fold06: degree=1, scale=1e-01, C=0.50
+ Fold06: degree=2, scale=1e-01, C=0.50
- Fold06: degree=2, scale=1e-01, C=0.50
+ Fold06: degree=3, scale=1e-01, C=0.50
- Fold06: degree=3, scale=1e-01, C=0.50
+ Fold06: degree=1, scale=1e+00, C=0.50
- Fold06: degree=1, scale=1e+00, C=0.50
+ Fold06: degree=2, scale=1e+00, C=0.50
- Fold06: degree=2, scale=1e+00, C=0.50
+ Fold06: degree=3, scale=1e+00, C=0.50
- Fold06: degree=3, scale=1e+00, C=0.50
+ Fold06: degree=1, scale=1e+01, C=0.50

```



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- Fold06: degree=1, scale=1e+01, C=0.50
+ Fold06: degree=2, scale=1e+01, C=0.50
- Fold06: degree=2, scale=1e+01, C=0.50
+ Fold06: degree=3, scale=1e+01, C=0.50
- Fold06: degree=3, scale=1e+01, C=0.50
+ Fold06: degree=1, scale=1e+02, C=0.50
- Fold06: degree=1, scale=1e+02, C=0.50
+ Fold06: degree=2, scale=1e+02, C=0.50
- Fold06: degree=2, scale=1e+02, C=0.50
+ Fold06: degree=3, scale=1e+02, C=0.50
- Fold06: degree=3, scale=1e+02, C=0.50
+ Fold06: degree=1, scale=1e-03, C=1.00
- Fold06: degree=1, scale=1e-03, C=1.00
+ Fold06: degree=2, scale=1e-03, C=1.00
- Fold06: degree=2, scale=1e-03, C=1.00
+ Fold06: degree=3, scale=1e-03, C=1.00
- Fold06: degree=3, scale=1e-03, C=1.00
+ Fold06: degree=1, scale=1e-02, C=1.00
- Fold06: degree=1, scale=1e-02, C=1.00
+ Fold06: degree=2, scale=1e-02, C=1.00
- Fold06: degree=2, scale=1e-02, C=1.00
+ Fold06: degree=3, scale=1e-02, C=1.00
- Fold06: degree=3, scale=1e-02, C=1.00
+ Fold06: degree=1, scale=1e-01, C=1.00
- Fold06: degree=1, scale=1e-01, C=1.00
+ Fold06: degree=2, scale=1e-01, C=1.00
- Fold06: degree=2, scale=1e-01, C=1.00
+ Fold06: degree=3, scale=1e-01, C=1.00
- Fold06: degree=3, scale=1e-01, C=1.00
+ Fold06: degree=1, scale=1e+00, C=1.00
- Fold06: degree=1, scale=1e+00, C=1.00
+ Fold06: degree=2, scale=1e+00, C=1.00
- Fold06: degree=2, scale=1e+00, C=1.00
+ Fold06: degree=3, scale=1e+00, C=1.00
- Fold06: degree=3, scale=1e+00, C=1.00
+ Fold06: degree=1, scale=1e+01, C=1.00
- Fold06: degree=1, scale=1e+01, C=1.00
+ Fold06: degree=2, scale=1e+01, C=1.00
- Fold06: degree=2, scale=1e+01, C=1.00
+ Fold06: degree=3, scale=1e+01, C=1.00
- Fold06: degree=3, scale=1e+01, C=1.00
+ Fold06: degree=1, scale=1e+02, C=1.00
- Fold06: degree=1, scale=1e+02, C=1.00
+ Fold06: degree=2, scale=1e+02, C=1.00
- Fold06: degree=2, scale=1e+02, C=1.00
+ Fold06: degree=3, scale=1e+02, C=1.00
- Fold06: degree=3, scale=1e+02, C=1.00
+ Fold06: degree=1, scale=1e-03, C=2.00
- Fold06: degree=1, scale=1e-03, C=2.00
+ Fold06: degree=2, scale=1e-03, C=2.00
- Fold06: degree=2, scale=1e-03, C=2.00
+ Fold06: degree=3, scale=1e-03, C=2.00
- Fold06: degree=3, scale=1e-03, C=2.00
+ Fold06: degree=1, scale=1e-02, C=2.00

```

```

- Fold06: degree=1, scale=1e-02, C=2.00
+ Fold06: degree=2, scale=1e-02, C=2.00
- Fold06: degree=2, scale=1e-02, C=2.00
+ Fold06: degree=3, scale=1e-02, C=2.00
- Fold06: degree=3, scale=1e-02, C=2.00
+ Fold06: degree=1, scale=1e-01, C=2.00
- Fold06: degree=1, scale=1e-01, C=2.00
+ Fold06: degree=2, scale=1e-01, C=2.00
- Fold06: degree=2, scale=1e-01, C=2.00
+ Fold06: degree=3, scale=1e-01, C=2.00
- Fold06: degree=3, scale=1e-01, C=2.00
+ Fold06: degree=1, scale=1e+00, C=2.00
- Fold06: degree=1, scale=1e+00, C=2.00
+ Fold06: degree=2, scale=1e+00, C=2.00
- Fold06: degree=2, scale=1e+00, C=2.00
+ Fold06: degree=3, scale=1e+00, C=2.00
- Fold06: degree=3, scale=1e+00, C=2.00
+ Fold06: degree=1, scale=1e+01, C=2.00
- Fold06: degree=1, scale=1e+01, C=2.00
+ Fold06: degree=2, scale=1e+01, C=2.00
- Fold06: degree=2, scale=1e+01, C=2.00
+ Fold06: degree=3, scale=1e+01, C=2.00
- Fold06: degree=3, scale=1e+01, C=2.00
+ Fold06: degree=1, scale=1e+02, C=2.00
- Fold06: degree=1, scale=1e+02, C=2.00
+ Fold06: degree=2, scale=1e+02, C=2.00
- Fold06: degree=2, scale=1e+02, C=2.00
+ Fold06: degree=3, scale=1e+02, C=2.00
- Fold06: degree=3, scale=1e+02, C=2.00
+ Fold06: degree=1, scale=1e-03, C=4.00
- Fold06: degree=1, scale=1e-03, C=4.00
+ Fold06: degree=2, scale=1e-03, C=4.00
- Fold06: degree=2, scale=1e-03, C=4.00
+ Fold06: degree=3, scale=1e-03, C=4.00
- Fold06: degree=3, scale=1e-03, C=4.00
+ Fold06: degree=1, scale=1e-02, C=4.00
- Fold06: degree=1, scale=1e-02, C=4.00
+ Fold06: degree=2, scale=1e-02, C=4.00
- Fold06: degree=2, scale=1e-02, C=4.00
+ Fold06: degree=3, scale=1e-02, C=4.00
- Fold06: degree=3, scale=1e-02, C=4.00
+ Fold06: degree=1, scale=1e-01, C=4.00
- Fold06: degree=1, scale=1e-01, C=4.00
+ Fold06: degree=2, scale=1e-01, C=4.00
- Fold06: degree=2, scale=1e-01, C=4.00
+ Fold06: degree=3, scale=1e-01, C=4.00
- Fold06: degree=3, scale=1e-01, C=4.00
+ Fold06: degree=1, scale=1e+00, C=4.00
- Fold06: degree=1, scale=1e+00, C=4.00
+ Fold06: degree=2, scale=1e+00, C=4.00
- Fold06: degree=2, scale=1e+00, C=4.00
+ Fold06: degree=3, scale=1e+00, C=4.00
- Fold06: degree=3, scale=1e+00, C=4.00
+ Fold06: degree=1, scale=1e+01, C=4.00

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- Fold06: degree=1, scale=1e+01, C=4.00
+ Fold06: degree=2, scale=1e+01, C=4.00
- Fold06: degree=2, scale=1e+01, C=4.00
+ Fold06: degree=3, scale=1e+01, C=4.00
- Fold06: degree=3, scale=1e+01, C=4.00
+ Fold06: degree=1, scale=1e+02, C=4.00
- Fold06: degree=1, scale=1e+02, C=4.00
+ Fold06: degree=2, scale=1e+02, C=4.00
- Fold06: degree=2, scale=1e+02, C=4.00
+ Fold06: degree=3, scale=1e+02, C=4.00
- Fold06: degree=3, scale=1e+02, C=4.00
+ Fold06: degree=1, scale=1e-03, C=8.00
- Fold06: degree=1, scale=1e-03, C=8.00
+ Fold06: degree=2, scale=1e-03, C=8.00
- Fold06: degree=2, scale=1e-03, C=8.00
+ Fold06: degree=3, scale=1e-03, C=8.00
- Fold06: degree=3, scale=1e-03, C=8.00
+ Fold06: degree=1, scale=1e-02, C=8.00
- Fold06: degree=1, scale=1e-02, C=8.00
+ Fold06: degree=2, scale=1e-02, C=8.00
- Fold06: degree=2, scale=1e-02, C=8.00
+ Fold06: degree=3, scale=1e-02, C=8.00
- Fold06: degree=3, scale=1e-02, C=8.00
+ Fold06: degree=1, scale=1e-01, C=8.00
- Fold06: degree=1, scale=1e-01, C=8.00
+ Fold06: degree=2, scale=1e-01, C=8.00
- Fold06: degree=2, scale=1e-01, C=8.00
+ Fold06: degree=3, scale=1e-01, C=8.00
- Fold06: degree=3, scale=1e-01, C=8.00
+ Fold06: degree=1, scale=1e+00, C=8.00
- Fold06: degree=1, scale=1e+00, C=8.00
+ Fold06: degree=2, scale=1e+00, C=8.00
- Fold06: degree=2, scale=1e+00, C=8.00
+ Fold06: degree=3, scale=1e+00, C=8.00
- Fold06: degree=3, scale=1e+00, C=8.00
+ Fold06: degree=1, scale=1e+01, C=8.00
- Fold06: degree=1, scale=1e+01, C=8.00
+ Fold06: degree=2, scale=1e+01, C=8.00
- Fold06: degree=2, scale=1e+01, C=8.00
+ Fold06: degree=3, scale=1e+01, C=8.00
- Fold06: degree=3, scale=1e+01, C=8.00
+ Fold06: degree=1, scale=1e+02, C=8.00
- Fold06: degree=1, scale=1e+02, C=8.00
+ Fold06: degree=2, scale=1e+02, C=8.00
- Fold06: degree=2, scale=1e+02, C=8.00
+ Fold06: degree=3, scale=1e+02, C=8.00
- Fold06: degree=3, scale=1e+02, C=8.00
+ Fold07: degree=1, scale=1e-03, C=0.25
- Fold07: degree=1, scale=1e-03, C=0.25
+ Fold07: degree=2, scale=1e-03, C=0.25
- Fold07: degree=2, scale=1e-03, C=0.25
+ Fold07: degree=3, scale=1e-03, C=0.25
- Fold07: degree=3, scale=1e-03, C=0.25
+ Fold07: degree=1, scale=1e-02, C=0.25

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- Fold07: degree=1, scale=1e-02, C=0.25
 + Fold07: degree=2, scale=1e-02, C=0.25
 - Fold07: degree=2, scale=1e-02, C=0.25
 + Fold07: degree=3, scale=1e-02, C=0.25
 - Fold07: degree=3, scale=1e-02, C=0.25
 + Fold07: degree=1, scale=1e-01, C=0.25
 - Fold07: degree=1, scale=1e-01, C=0.25
 + Fold07: degree=2, scale=1e-01, C=0.25
 - Fold07: degree=2, scale=1e-01, C=0.25
 + Fold07: degree=3, scale=1e-01, C=0.25
 - Fold07: degree=3, scale=1e-01, C=0.25
 + Fold07: degree=1, scale=1e+00, C=0.25
 - Fold07: degree=1, scale=1e+00, C=0.25
 + Fold07: degree=2, scale=1e+00, C=0.25
 - Fold07: degree=2, scale=1e+00, C=0.25
 + Fold07: degree=3, scale=1e+00, C=0.25
 - Fold07: degree=3, scale=1e+00, C=0.25
 + Fold07: degree=1, scale=1e+01, C=0.25
 - Fold07: degree=1, scale=1e+01, C=0.25
 + Fold07: degree=2, scale=1e+01, C=0.25
 - Fold07: degree=2, scale=1e+01, C=0.25
 + Fold07: degree=3, scale=1e+01, C=0.25
 - Fold07: degree=3, scale=1e+01, C=0.25
 + Fold07: degree=1, scale=1e+02, C=0.25
 - Fold07: degree=1, scale=1e+02, C=0.25
 + Fold07: degree=2, scale=1e+02, C=0.25
 - Fold07: degree=2, scale=1e+02, C=0.25
 + Fold07: degree=3, scale=1e+02, C=0.25
 - Fold07: degree=3, scale=1e+02, C=0.25
 + Fold07: degree=1, scale=1e-03, C=0.50
 - Fold07: degree=1, scale=1e-03, C=0.50
 + Fold07: degree=2, scale=1e-03, C=0.50
 - Fold07: degree=2, scale=1e-03, C=0.50
 + Fold07: degree=3, scale=1e-03, C=0.50
 - Fold07: degree=3, scale=1e-03, C=0.50
 + Fold07: degree=1, scale=1e-02, C=0.50
 - Fold07: degree=1, scale=1e-02, C=0.50
 + Fold07: degree=2, scale=1e-02, C=0.50
 - Fold07: degree=2, scale=1e-02, C=0.50
 + Fold07: degree=3, scale=1e-02, C=0.50
 - Fold07: degree=3, scale=1e-02, C=0.50
 + Fold07: degree=1, scale=1e-01, C=0.50
 - Fold07: degree=1, scale=1e-01, C=0.50
 + Fold07: degree=2, scale=1e-01, C=0.50
 - Fold07: degree=2, scale=1e-01, C=0.50
 + Fold07: degree=3, scale=1e-01, C=0.50
 - Fold07: degree=3, scale=1e-01, C=0.50
 + Fold07: degree=1, scale=1e+00, C=0.50
 - Fold07: degree=1, scale=1e+00, C=0.50
 + Fold07: degree=2, scale=1e+00, C=0.50
 - Fold07: degree=2, scale=1e+00, C=0.50
 + Fold07: degree=3, scale=1e+00, C=0.50
 - Fold07: degree=3, scale=1e+00, C=0.50
 + Fold07: degree=1, scale=1e+01, C=0.50

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- Fold07: degree=1, scale=1e+01, C=0.50
+ Fold07: degree=2, scale=1e+01, C=0.50
- Fold07: degree=2, scale=1e+01, C=0.50
+ Fold07: degree=3, scale=1e+01, C=0.50
- Fold07: degree=3, scale=1e+01, C=0.50
+ Fold07: degree=1, scale=1e+02, C=0.50
- Fold07: degree=1, scale=1e+02, C=0.50
+ Fold07: degree=2, scale=1e+02, C=0.50
- Fold07: degree=2, scale=1e+02, C=0.50
+ Fold07: degree=3, scale=1e+02, C=0.50
- Fold07: degree=3, scale=1e+02, C=0.50
+ Fold07: degree=1, scale=1e-03, C=1.00
- Fold07: degree=1, scale=1e-03, C=1.00
+ Fold07: degree=2, scale=1e-03, C=1.00
- Fold07: degree=2, scale=1e-03, C=1.00
+ Fold07: degree=3, scale=1e-03, C=1.00
- Fold07: degree=3, scale=1e-03, C=1.00
+ Fold07: degree=1, scale=1e-02, C=1.00
- Fold07: degree=1, scale=1e-02, C=1.00
+ Fold07: degree=2, scale=1e-02, C=1.00
- Fold07: degree=2, scale=1e-02, C=1.00
+ Fold07: degree=3, scale=1e-02, C=1.00
- Fold07: degree=3, scale=1e-02, C=1.00
+ Fold07: degree=1, scale=1e-01, C=1.00
- Fold07: degree=1, scale=1e-01, C=1.00
+ Fold07: degree=2, scale=1e-01, C=1.00
- Fold07: degree=2, scale=1e-01, C=1.00
+ Fold07: degree=3, scale=1e-01, C=1.00
- Fold07: degree=3, scale=1e-01, C=1.00
+ Fold07: degree=1, scale=1e+00, C=1.00
- Fold07: degree=1, scale=1e+00, C=1.00
+ Fold07: degree=2, scale=1e+00, C=1.00
- Fold07: degree=2, scale=1e+00, C=1.00
+ Fold07: degree=3, scale=1e+00, C=1.00
- Fold07: degree=3, scale=1e+00, C=1.00
+ Fold07: degree=1, scale=1e+01, C=1.00
- Fold07: degree=1, scale=1e+01, C=1.00
+ Fold07: degree=2, scale=1e+01, C=1.00
- Fold07: degree=2, scale=1e+01, C=1.00
+ Fold07: degree=3, scale=1e+01, C=1.00
- Fold07: degree=3, scale=1e+01, C=1.00
+ Fold07: degree=1, scale=1e+02, C=1.00
- Fold07: degree=1, scale=1e+02, C=1.00
+ Fold07: degree=2, scale=1e+02, C=1.00
- Fold07: degree=2, scale=1e+02, C=1.00
+ Fold07: degree=3, scale=1e+02, C=1.00
- Fold07: degree=3, scale=1e+02, C=1.00
+ Fold07: degree=1, scale=1e-03, C=2.00
- Fold07: degree=1, scale=1e-03, C=2.00
+ Fold07: degree=2, scale=1e-03, C=2.00
- Fold07: degree=2, scale=1e-03, C=2.00
+ Fold07: degree=3, scale=1e-03, C=2.00
- Fold07: degree=3, scale=1e-03, C=2.00
+ Fold07: degree=1, scale=1e-02, C=2.00

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- Fold07: degree=1, scale=1e-02, C=2.00
+ Fold07: degree=2, scale=1e-02, C=2.00
- Fold07: degree=2, scale=1e-02, C=2.00
+ Fold07: degree=3, scale=1e-02, C=2.00
- Fold07: degree=3, scale=1e-02, C=2.00
+ Fold07: degree=1, scale=1e-01, C=2.00
- Fold07: degree=1, scale=1e-01, C=2.00
+ Fold07: degree=2, scale=1e-01, C=2.00
- Fold07: degree=2, scale=1e-01, C=2.00
+ Fold07: degree=3, scale=1e-01, C=2.00
- Fold07: degree=3, scale=1e-01, C=2.00
+ Fold07: degree=1, scale=1e+00, C=2.00
- Fold07: degree=1, scale=1e+00, C=2.00
+ Fold07: degree=2, scale=1e+00, C=2.00
- Fold07: degree=2, scale=1e+00, C=2.00
+ Fold07: degree=3, scale=1e+00, C=2.00
- Fold07: degree=3, scale=1e+00, C=2.00
+ Fold07: degree=1, scale=1e+01, C=2.00
- Fold07: degree=1, scale=1e+01, C=2.00
+ Fold07: degree=2, scale=1e+01, C=2.00
- Fold07: degree=2, scale=1e+01, C=2.00
+ Fold07: degree=3, scale=1e+01, C=2.00
- Fold07: degree=3, scale=1e+01, C=2.00
+ Fold07: degree=1, scale=1e+02, C=2.00
- Fold07: degree=1, scale=1e+02, C=2.00
+ Fold07: degree=2, scale=1e+02, C=2.00
- Fold07: degree=2, scale=1e+02, C=2.00
+ Fold07: degree=3, scale=1e+02, C=2.00
- Fold07: degree=3, scale=1e+02, C=2.00
+ Fold07: degree=1, scale=1e-03, C=4.00
- Fold07: degree=1, scale=1e-03, C=4.00
+ Fold07: degree=2, scale=1e-03, C=4.00
- Fold07: degree=2, scale=1e-03, C=4.00
+ Fold07: degree=3, scale=1e-03, C=4.00
- Fold07: degree=3, scale=1e-03, C=4.00
+ Fold07: degree=1, scale=1e-02, C=4.00
- Fold07: degree=1, scale=1e-02, C=4.00
+ Fold07: degree=2, scale=1e-02, C=4.00
- Fold07: degree=2, scale=1e-02, C=4.00
+ Fold07: degree=3, scale=1e-02, C=4.00
- Fold07: degree=3, scale=1e-02, C=4.00
+ Fold07: degree=1, scale=1e-01, C=4.00
- Fold07: degree=1, scale=1e-01, C=4.00
+ Fold07: degree=2, scale=1e-01, C=4.00
- Fold07: degree=2, scale=1e-01, C=4.00
+ Fold07: degree=3, scale=1e-01, C=4.00
- Fold07: degree=3, scale=1e-01, C=4.00
+ Fold07: degree=1, scale=1e+00, C=4.00
- Fold07: degree=1, scale=1e+00, C=4.00
+ Fold07: degree=2, scale=1e+00, C=4.00
- Fold07: degree=2, scale=1e+00, C=4.00
+ Fold07: degree=3, scale=1e+00, C=4.00
- Fold07: degree=3, scale=1e+00, C=4.00
+ Fold07: degree=1, scale=1e+01, C=4.00

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- Fold07: degree=1, scale=1e+01, C=4.00
+ Fold07: degree=2, scale=1e+01, C=4.00
- Fold07: degree=2, scale=1e+01, C=4.00
+ Fold07: degree=3, scale=1e+01, C=4.00
- Fold07: degree=3, scale=1e+01, C=4.00
+ Fold07: degree=1, scale=1e+02, C=4.00
- Fold07: degree=1, scale=1e+02, C=4.00
+ Fold07: degree=2, scale=1e+02, C=4.00
- Fold07: degree=2, scale=1e+02, C=4.00
+ Fold07: degree=3, scale=1e+02, C=4.00
- Fold07: degree=3, scale=1e+02, C=4.00
+ Fold07: degree=1, scale=1e-03, C=8.00
- Fold07: degree=1, scale=1e-03, C=8.00
+ Fold07: degree=2, scale=1e-03, C=8.00
- Fold07: degree=2, scale=1e-03, C=8.00
+ Fold07: degree=3, scale=1e-03, C=8.00
- Fold07: degree=3, scale=1e-03, C=8.00
+ Fold07: degree=1, scale=1e-02, C=8.00
- Fold07: degree=1, scale=1e-02, C=8.00
+ Fold07: degree=2, scale=1e-02, C=8.00
- Fold07: degree=2, scale=1e-02, C=8.00
+ Fold07: degree=3, scale=1e-02, C=8.00
- Fold07: degree=3, scale=1e-02, C=8.00
+ Fold07: degree=1, scale=1e-01, C=8.00
- Fold07: degree=1, scale=1e-01, C=8.00
+ Fold07: degree=2, scale=1e-01, C=8.00
- Fold07: degree=2, scale=1e-01, C=8.00
+ Fold07: degree=3, scale=1e-01, C=8.00
- Fold07: degree=3, scale=1e-01, C=8.00
+ Fold07: degree=1, scale=1e+00, C=8.00
- Fold07: degree=1, scale=1e+00, C=8.00
+ Fold07: degree=2, scale=1e+00, C=8.00
- Fold07: degree=2, scale=1e+00, C=8.00
+ Fold07: degree=3, scale=1e+00, C=8.00
- Fold07: degree=3, scale=1e+00, C=8.00
+ Fold07: degree=1, scale=1e+01, C=8.00
- Fold07: degree=1, scale=1e+01, C=8.00
+ Fold07: degree=2, scale=1e+01, C=8.00
- Fold07: degree=2, scale=1e+01, C=8.00
+ Fold07: degree=3, scale=1e+01, C=8.00
- Fold07: degree=3, scale=1e+01, C=8.00
+ Fold07: degree=1, scale=1e+02, C=8.00
- Fold07: degree=1, scale=1e+02, C=8.00
+ Fold07: degree=2, scale=1e+02, C=8.00
- Fold07: degree=2, scale=1e+02, C=8.00
+ Fold07: degree=3, scale=1e+02, C=8.00
- Fold07: degree=3, scale=1e+02, C=8.00
+ Fold08: degree=1, scale=1e-03, C=0.25
- Fold08: degree=1, scale=1e-03, C=0.25
+ Fold08: degree=2, scale=1e-03, C=0.25
- Fold08: degree=2, scale=1e-03, C=0.25
+ Fold08: degree=3, scale=1e-03, C=0.25
- Fold08: degree=3, scale=1e-03, C=0.25
+ Fold08: degree=1, scale=1e-02, C=0.25

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- Fold08: degree=1, scale=1e-02, C=0.25
+ Fold08: degree=2, scale=1e-02, C=0.25
- Fold08: degree=2, scale=1e-02, C=0.25
+ Fold08: degree=3, scale=1e-02, C=0.25
- Fold08: degree=3, scale=1e-02, C=0.25
+ Fold08: degree=1, scale=1e-01, C=0.25
- Fold08: degree=1, scale=1e-01, C=0.25
+ Fold08: degree=2, scale=1e-01, C=0.25
- Fold08: degree=2, scale=1e-01, C=0.25
+ Fold08: degree=3, scale=1e-01, C=0.25
- Fold08: degree=3, scale=1e-01, C=0.25
+ Fold08: degree=1, scale=1e+00, C=0.25
- Fold08: degree=1, scale=1e+00, C=0.25
+ Fold08: degree=2, scale=1e+00, C=0.25
- Fold08: degree=2, scale=1e+00, C=0.25
+ Fold08: degree=3, scale=1e+00, C=0.25
- Fold08: degree=3, scale=1e+00, C=0.25
+ Fold08: degree=1, scale=1e+01, C=0.25
- Fold08: degree=1, scale=1e+01, C=0.25
+ Fold08: degree=2, scale=1e+01, C=0.25
- Fold08: degree=2, scale=1e+01, C=0.25
+ Fold08: degree=3, scale=1e+01, C=0.25
- Fold08: degree=3, scale=1e+01, C=0.25
+ Fold08: degree=1, scale=1e+02, C=0.25
- Fold08: degree=1, scale=1e+02, C=0.25
+ Fold08: degree=2, scale=1e+02, C=0.25
- Fold08: degree=2, scale=1e+02, C=0.25
+ Fold08: degree=3, scale=1e+02, C=0.25
- Fold08: degree=3, scale=1e+02, C=0.25
+ Fold08: degree=1, scale=1e-03, C=0.50
- Fold08: degree=1, scale=1e-03, C=0.50
+ Fold08: degree=2, scale=1e-03, C=0.50
- Fold08: degree=2, scale=1e-03, C=0.50
+ Fold08: degree=3, scale=1e-03, C=0.50
- Fold08: degree=3, scale=1e-03, C=0.50
+ Fold08: degree=1, scale=1e-02, C=0.50
- Fold08: degree=1, scale=1e-02, C=0.50
+ Fold08: degree=2, scale=1e-02, C=0.50
- Fold08: degree=2, scale=1e-02, C=0.50
+ Fold08: degree=3, scale=1e-02, C=0.50
- Fold08: degree=3, scale=1e-02, C=0.50
+ Fold08: degree=1, scale=1e-01, C=0.50
- Fold08: degree=1, scale=1e-01, C=0.50
+ Fold08: degree=2, scale=1e-01, C=0.50
- Fold08: degree=2, scale=1e-01, C=0.50
+ Fold08: degree=3, scale=1e-01, C=0.50
- Fold08: degree=3, scale=1e-01, C=0.50
+ Fold08: degree=1, scale=1e+00, C=0.50
- Fold08: degree=1, scale=1e+00, C=0.50
+ Fold08: degree=2, scale=1e+00, C=0.50
- Fold08: degree=2, scale=1e+00, C=0.50
+ Fold08: degree=3, scale=1e+00, C=0.50
- Fold08: degree=3, scale=1e+00, C=0.50
+ Fold08: degree=1, scale=1e+01, C=0.50

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- Fold08: degree=1, scale=1e+01, C=0.50
+ Fold08: degree=2, scale=1e+01, C=0.50
- Fold08: degree=2, scale=1e+01, C=0.50
+ Fold08: degree=3, scale=1e+01, C=0.50
- Fold08: degree=3, scale=1e+01, C=0.50
+ Fold08: degree=1, scale=1e+02, C=0.50
- Fold08: degree=1, scale=1e+02, C=0.50
+ Fold08: degree=2, scale=1e+02, C=0.50
- Fold08: degree=2, scale=1e+02, C=0.50
+ Fold08: degree=3, scale=1e+02, C=0.50
- Fold08: degree=3, scale=1e+02, C=0.50
+ Fold08: degree=1, scale=1e-03, C=1.00
- Fold08: degree=1, scale=1e-03, C=1.00
+ Fold08: degree=2, scale=1e-03, C=1.00
- Fold08: degree=2, scale=1e-03, C=1.00
+ Fold08: degree=3, scale=1e-03, C=1.00
- Fold08: degree=3, scale=1e-03, C=1.00
+ Fold08: degree=1, scale=1e-02, C=1.00
- Fold08: degree=1, scale=1e-02, C=1.00
+ Fold08: degree=2, scale=1e-02, C=1.00
- Fold08: degree=2, scale=1e-02, C=1.00
+ Fold08: degree=3, scale=1e-02, C=1.00
- Fold08: degree=3, scale=1e-02, C=1.00
+ Fold08: degree=1, scale=1e-01, C=1.00
- Fold08: degree=1, scale=1e-01, C=1.00
+ Fold08: degree=2, scale=1e-01, C=1.00
- Fold08: degree=2, scale=1e-01, C=1.00
+ Fold08: degree=3, scale=1e-01, C=1.00
- Fold08: degree=3, scale=1e-01, C=1.00
+ Fold08: degree=1, scale=1e+00, C=1.00
- Fold08: degree=1, scale=1e+00, C=1.00
+ Fold08: degree=2, scale=1e+00, C=1.00
- Fold08: degree=2, scale=1e+00, C=1.00
+ Fold08: degree=3, scale=1e+00, C=1.00
- Fold08: degree=3, scale=1e+00, C=1.00
+ Fold08: degree=1, scale=1e+01, C=1.00
- Fold08: degree=1, scale=1e+01, C=1.00
+ Fold08: degree=2, scale=1e+01, C=1.00
- Fold08: degree=2, scale=1e+01, C=1.00
+ Fold08: degree=3, scale=1e+01, C=1.00
- Fold08: degree=3, scale=1e+01, C=1.00
+ Fold08: degree=1, scale=1e+02, C=1.00
- Fold08: degree=1, scale=1e+02, C=1.00
+ Fold08: degree=2, scale=1e+02, C=1.00
- Fold08: degree=2, scale=1e+02, C=1.00
+ Fold08: degree=3, scale=1e+02, C=1.00
- Fold08: degree=3, scale=1e+02, C=1.00
+ Fold08: degree=1, scale=1e-03, C=2.00
- Fold08: degree=1, scale=1e-03, C=2.00
+ Fold08: degree=2, scale=1e-03, C=2.00
- Fold08: degree=2, scale=1e-03, C=2.00
+ Fold08: degree=3, scale=1e-03, C=2.00
- Fold08: degree=3, scale=1e-03, C=2.00
+ Fold08: degree=1, scale=1e-02, C=2.00

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- Fold08: degree=1, scale=1e-02, C=2.00
+ Fold08: degree=2, scale=1e-02, C=2.00
- Fold08: degree=2, scale=1e-02, C=2.00
+ Fold08: degree=3, scale=1e-02, C=2.00
- Fold08: degree=3, scale=1e-02, C=2.00
+ Fold08: degree=1, scale=1e-01, C=2.00
- Fold08: degree=1, scale=1e-01, C=2.00
+ Fold08: degree=2, scale=1e-01, C=2.00
- Fold08: degree=2, scale=1e-01, C=2.00
+ Fold08: degree=3, scale=1e-01, C=2.00
- Fold08: degree=3, scale=1e-01, C=2.00
+ Fold08: degree=1, scale=1e+00, C=2.00
- Fold08: degree=1, scale=1e+00, C=2.00
+ Fold08: degree=2, scale=1e+00, C=2.00
- Fold08: degree=2, scale=1e+00, C=2.00
+ Fold08: degree=3, scale=1e+00, C=2.00
- Fold08: degree=3, scale=1e+00, C=2.00
+ Fold08: degree=1, scale=1e+01, C=2.00
- Fold08: degree=1, scale=1e+01, C=2.00
+ Fold08: degree=2, scale=1e+01, C=2.00
- Fold08: degree=2, scale=1e+01, C=2.00
+ Fold08: degree=3, scale=1e+01, C=2.00
- Fold08: degree=3, scale=1e+01, C=2.00
+ Fold08: degree=1, scale=1e+02, C=2.00
- Fold08: degree=1, scale=1e+02, C=2.00
+ Fold08: degree=2, scale=1e+02, C=2.00
- Fold08: degree=2, scale=1e+02, C=2.00
+ Fold08: degree=3, scale=1e+02, C=2.00
- Fold08: degree=3, scale=1e+02, C=2.00
+ Fold08: degree=1, scale=1e-03, C=4.00
- Fold08: degree=1, scale=1e-03, C=4.00
+ Fold08: degree=2, scale=1e-03, C=4.00
- Fold08: degree=2, scale=1e-03, C=4.00
+ Fold08: degree=3, scale=1e-03, C=4.00
- Fold08: degree=3, scale=1e-03, C=4.00
+ Fold08: degree=1, scale=1e-02, C=4.00
- Fold08: degree=1, scale=1e-02, C=4.00
+ Fold08: degree=2, scale=1e-02, C=4.00
- Fold08: degree=2, scale=1e-02, C=4.00
+ Fold08: degree=3, scale=1e-02, C=4.00
- Fold08: degree=3, scale=1e-02, C=4.00
+ Fold08: degree=1, scale=1e-01, C=4.00
- Fold08: degree=1, scale=1e-01, C=4.00
+ Fold08: degree=2, scale=1e-01, C=4.00
- Fold08: degree=2, scale=1e-01, C=4.00
+ Fold08: degree=3, scale=1e-01, C=4.00
- Fold08: degree=3, scale=1e-01, C=4.00
+ Fold08: degree=1, scale=1e+00, C=4.00
- Fold08: degree=1, scale=1e+00, C=4.00
+ Fold08: degree=2, scale=1e+00, C=4.00
- Fold08: degree=2, scale=1e+00, C=4.00
+ Fold08: degree=3, scale=1e+00, C=4.00
- Fold08: degree=3, scale=1e+00, C=4.00
+ Fold08: degree=1, scale=1e+01, C=4.00

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- Fold08: degree=1, scale=1e+01, C=4.00
+ Fold08: degree=2, scale=1e+01, C=4.00
- Fold08: degree=2, scale=1e+01, C=4.00
+ Fold08: degree=3, scale=1e+01, C=4.00
- Fold08: degree=3, scale=1e+01, C=4.00
+ Fold08: degree=1, scale=1e+02, C=4.00
- Fold08: degree=1, scale=1e+02, C=4.00
+ Fold08: degree=2, scale=1e+02, C=4.00
- Fold08: degree=2, scale=1e+02, C=4.00
+ Fold08: degree=3, scale=1e+02, C=4.00
- Fold08: degree=3, scale=1e+02, C=4.00
+ Fold08: degree=1, scale=1e-03, C=8.00
- Fold08: degree=1, scale=1e-03, C=8.00
+ Fold08: degree=2, scale=1e-03, C=8.00
- Fold08: degree=2, scale=1e-03, C=8.00
+ Fold08: degree=3, scale=1e-03, C=8.00
- Fold08: degree=3, scale=1e-03, C=8.00
+ Fold08: degree=1, scale=1e-02, C=8.00
- Fold08: degree=1, scale=1e-02, C=8.00
+ Fold08: degree=2, scale=1e-02, C=8.00
- Fold08: degree=2, scale=1e-02, C=8.00
+ Fold08: degree=3, scale=1e-02, C=8.00
- Fold08: degree=3, scale=1e-02, C=8.00
+ Fold08: degree=1, scale=1e-01, C=8.00
- Fold08: degree=1, scale=1e-01, C=8.00
+ Fold08: degree=2, scale=1e-01, C=8.00
- Fold08: degree=2, scale=1e-01, C=8.00
+ Fold08: degree=3, scale=1e-01, C=8.00
- Fold08: degree=3, scale=1e-01, C=8.00
+ Fold08: degree=1, scale=1e+00, C=8.00
- Fold08: degree=1, scale=1e+00, C=8.00
+ Fold08: degree=2, scale=1e+00, C=8.00
- Fold08: degree=2, scale=1e+00, C=8.00
+ Fold08: degree=3, scale=1e+00, C=8.00
- Fold08: degree=3, scale=1e+00, C=8.00
+ Fold08: degree=1, scale=1e+01, C=8.00
- Fold08: degree=1, scale=1e+01, C=8.00
+ Fold08: degree=2, scale=1e+01, C=8.00
- Fold08: degree=2, scale=1e+01, C=8.00
+ Fold08: degree=3, scale=1e+01, C=8.00
- Fold08: degree=3, scale=1e+01, C=8.00
+ Fold08: degree=1, scale=1e+02, C=8.00
- Fold08: degree=1, scale=1e+02, C=8.00
+ Fold08: degree=2, scale=1e+02, C=8.00
- Fold08: degree=2, scale=1e+02, C=8.00
+ Fold08: degree=3, scale=1e+02, C=8.00
- Fold08: degree=3, scale=1e+02, C=8.00
+ Fold09: degree=1, scale=1e-03, C=0.25
- Fold09: degree=1, scale=1e-03, C=0.25
+ Fold09: degree=2, scale=1e-03, C=0.25
- Fold09: degree=2, scale=1e-03, C=0.25
+ Fold09: degree=3, scale=1e-03, C=0.25
- Fold09: degree=3, scale=1e-03, C=0.25
+ Fold09: degree=1, scale=1e-02, C=0.25

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- Fold09: degree=1, scale=1e-02, C=0.25
 + Fold09: degree=2, scale=1e-02, C=0.25
 - Fold09: degree=2, scale=1e-02, C=0.25
 + Fold09: degree=3, scale=1e-02, C=0.25
 - Fold09: degree=3, scale=1e-02, C=0.25
 + Fold09: degree=1, scale=1e-01, C=0.25
 - Fold09: degree=1, scale=1e-01, C=0.25
 + Fold09: degree=2, scale=1e-01, C=0.25
 - Fold09: degree=2, scale=1e-01, C=0.25
 + Fold09: degree=3, scale=1e-01, C=0.25
 - Fold09: degree=3, scale=1e-01, C=0.25
 + Fold09: degree=1, scale=1e+00, C=0.25
 - Fold09: degree=1, scale=1e+00, C=0.25
 + Fold09: degree=2, scale=1e+00, C=0.25
 - Fold09: degree=2, scale=1e+00, C=0.25
 + Fold09: degree=3, scale=1e+00, C=0.25
 - Fold09: degree=3, scale=1e+00, C=0.25
 + Fold09: degree=1, scale=1e+01, C=0.25
 - Fold09: degree=1, scale=1e+01, C=0.25
 + Fold09: degree=2, scale=1e+01, C=0.25
 - Fold09: degree=2, scale=1e+01, C=0.25
 + Fold09: degree=3, scale=1e+01, C=0.25
 - Fold09: degree=3, scale=1e+01, C=0.25
 + Fold09: degree=1, scale=1e+02, C=0.25
 - Fold09: degree=1, scale=1e+02, C=0.25
 + Fold09: degree=2, scale=1e+02, C=0.25
 - Fold09: degree=2, scale=1e+02, C=0.25
 + Fold09: degree=3, scale=1e+02, C=0.25
 - Fold09: degree=3, scale=1e+02, C=0.25
 + Fold09: degree=1, scale=1e-03, C=0.50
 - Fold09: degree=1, scale=1e-03, C=0.50
 + Fold09: degree=2, scale=1e-03, C=0.50
 - Fold09: degree=2, scale=1e-03, C=0.50
 + Fold09: degree=3, scale=1e-03, C=0.50
 - Fold09: degree=3, scale=1e-03, C=0.50
 + Fold09: degree=1, scale=1e-02, C=0.50
 - Fold09: degree=1, scale=1e-02, C=0.50
 + Fold09: degree=2, scale=1e-02, C=0.50
 - Fold09: degree=2, scale=1e-02, C=0.50
 + Fold09: degree=3, scale=1e-02, C=0.50
 - Fold09: degree=3, scale=1e-02, C=0.50
 + Fold09: degree=1, scale=1e-01, C=0.50
 - Fold09: degree=1, scale=1e-01, C=0.50
 + Fold09: degree=2, scale=1e-01, C=0.50
 - Fold09: degree=2, scale=1e-01, C=0.50
 + Fold09: degree=3, scale=1e-01, C=0.50
 - Fold09: degree=3, scale=1e-01, C=0.50
 + Fold09: degree=1, scale=1e+00, C=0.50
 - Fold09: degree=1, scale=1e+00, C=0.50
 + Fold09: degree=2, scale=1e+00, C=0.50
 - Fold09: degree=2, scale=1e+00, C=0.50
 + Fold09: degree=3, scale=1e+00, C=0.50
 - Fold09: degree=3, scale=1e+00, C=0.50
 + Fold09: degree=1, scale=1e+01, C=0.50

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- Fold09: degree=1, scale=1e+01, C=0.50
+ Fold09: degree=2, scale=1e+01, C=0.50
- Fold09: degree=2, scale=1e+01, C=0.50
+ Fold09: degree=3, scale=1e+01, C=0.50
- Fold09: degree=3, scale=1e+01, C=0.50
+ Fold09: degree=1, scale=1e+02, C=0.50
- Fold09: degree=1, scale=1e+02, C=0.50
+ Fold09: degree=2, scale=1e+02, C=0.50
- Fold09: degree=2, scale=1e+02, C=0.50
+ Fold09: degree=3, scale=1e+02, C=0.50
- Fold09: degree=3, scale=1e+02, C=0.50
+ Fold09: degree=1, scale=1e-03, C=1.00
- Fold09: degree=1, scale=1e-03, C=1.00
+ Fold09: degree=2, scale=1e-03, C=1.00
- Fold09: degree=2, scale=1e-03, C=1.00
+ Fold09: degree=3, scale=1e-03, C=1.00
- Fold09: degree=3, scale=1e-03, C=1.00
+ Fold09: degree=1, scale=1e-02, C=1.00
- Fold09: degree=1, scale=1e-02, C=1.00
+ Fold09: degree=2, scale=1e-02, C=1.00
- Fold09: degree=2, scale=1e-02, C=1.00
+ Fold09: degree=3, scale=1e-02, C=1.00
- Fold09: degree=3, scale=1e-02, C=1.00
+ Fold09: degree=1, scale=1e-01, C=1.00
- Fold09: degree=1, scale=1e-01, C=1.00
+ Fold09: degree=2, scale=1e-01, C=1.00
- Fold09: degree=2, scale=1e-01, C=1.00
+ Fold09: degree=3, scale=1e-01, C=1.00
- Fold09: degree=3, scale=1e-01, C=1.00
+ Fold09: degree=1, scale=1e+00, C=1.00
- Fold09: degree=1, scale=1e+00, C=1.00
+ Fold09: degree=2, scale=1e+00, C=1.00
- Fold09: degree=2, scale=1e+00, C=1.00
+ Fold09: degree=3, scale=1e+00, C=1.00
- Fold09: degree=3, scale=1e+00, C=1.00
+ Fold09: degree=1, scale=1e+01, C=1.00
- Fold09: degree=1, scale=1e+01, C=1.00
+ Fold09: degree=2, scale=1e+01, C=1.00
- Fold09: degree=2, scale=1e+01, C=1.00
+ Fold09: degree=3, scale=1e+01, C=1.00
- Fold09: degree=3, scale=1e+01, C=1.00
+ Fold09: degree=1, scale=1e+02, C=1.00
- Fold09: degree=1, scale=1e+02, C=1.00
+ Fold09: degree=2, scale=1e+02, C=1.00
- Fold09: degree=2, scale=1e+02, C=1.00
+ Fold09: degree=3, scale=1e+02, C=1.00
- Fold09: degree=3, scale=1e+02, C=1.00
+ Fold09: degree=1, scale=1e-03, C=2.00
- Fold09: degree=1, scale=1e-03, C=2.00
+ Fold09: degree=2, scale=1e-03, C=2.00
- Fold09: degree=2, scale=1e-03, C=2.00
+ Fold09: degree=3, scale=1e-03, C=2.00
- Fold09: degree=3, scale=1e-03, C=2.00
+ Fold09: degree=1, scale=1e-02, C=2.00

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```

- Fold09: degree=1, scale=1e-02, C=2.00
+ Fold09: degree=2, scale=1e-02, C=2.00
- Fold09: degree=2, scale=1e-02, C=2.00
+ Fold09: degree=3, scale=1e-02, C=2.00
- Fold09: degree=3, scale=1e-02, C=2.00
+ Fold09: degree=1, scale=1e-01, C=2.00
- Fold09: degree=1, scale=1e-01, C=2.00
+ Fold09: degree=2, scale=1e-01, C=2.00
- Fold09: degree=2, scale=1e-01, C=2.00
+ Fold09: degree=3, scale=1e-01, C=2.00
- Fold09: degree=3, scale=1e-01, C=2.00
+ Fold09: degree=1, scale=1e+00, C=2.00
- Fold09: degree=1, scale=1e+00, C=2.00
+ Fold09: degree=2, scale=1e+00, C=2.00
- Fold09: degree=2, scale=1e+00, C=2.00
+ Fold09: degree=3, scale=1e+00, C=2.00
- Fold09: degree=3, scale=1e+00, C=2.00
+ Fold09: degree=1, scale=1e+01, C=2.00
- Fold09: degree=1, scale=1e+01, C=2.00
+ Fold09: degree=2, scale=1e+01, C=2.00
- Fold09: degree=2, scale=1e+01, C=2.00
+ Fold09: degree=3, scale=1e+01, C=2.00
- Fold09: degree=3, scale=1e+01, C=2.00
+ Fold09: degree=1, scale=1e+02, C=2.00
- Fold09: degree=1, scale=1e+02, C=2.00
+ Fold09: degree=2, scale=1e+02, C=2.00
- Fold09: degree=2, scale=1e+02, C=2.00
+ Fold09: degree=3, scale=1e+02, C=2.00
- Fold09: degree=3, scale=1e+02, C=2.00
+ Fold09: degree=1, scale=1e-03, C=4.00
- Fold09: degree=1, scale=1e-03, C=4.00
+ Fold09: degree=2, scale=1e-03, C=4.00
- Fold09: degree=2, scale=1e-03, C=4.00
+ Fold09: degree=3, scale=1e-03, C=4.00
- Fold09: degree=3, scale=1e-03, C=4.00
+ Fold09: degree=1, scale=1e-02, C=4.00
- Fold09: degree=1, scale=1e-02, C=4.00
+ Fold09: degree=2, scale=1e-02, C=4.00
- Fold09: degree=2, scale=1e-02, C=4.00
+ Fold09: degree=3, scale=1e-02, C=4.00
- Fold09: degree=3, scale=1e-02, C=4.00
+ Fold09: degree=1, scale=1e-01, C=4.00
- Fold09: degree=1, scale=1e-01, C=4.00
+ Fold09: degree=2, scale=1e-01, C=4.00
- Fold09: degree=2, scale=1e-01, C=4.00
+ Fold09: degree=3, scale=1e-01, C=4.00
- Fold09: degree=3, scale=1e-01, C=4.00
+ Fold09: degree=1, scale=1e+00, C=4.00
- Fold09: degree=1, scale=1e+00, C=4.00
+ Fold09: degree=2, scale=1e+00, C=4.00
- Fold09: degree=2, scale=1e+00, C=4.00
+ Fold09: degree=3, scale=1e+00, C=4.00
- Fold09: degree=3, scale=1e+00, C=4.00
+ Fold09: degree=1, scale=1e+01, C=4.00

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- Fold09: degree=1, scale=1e+01, C=4.00
+ Fold09: degree=2, scale=1e+01, C=4.00
- Fold09: degree=2, scale=1e+01, C=4.00
+ Fold09: degree=3, scale=1e+01, C=4.00
- Fold09: degree=3, scale=1e+01, C=4.00
+ Fold09: degree=1, scale=1e+02, C=4.00
- Fold09: degree=1, scale=1e+02, C=4.00
+ Fold09: degree=2, scale=1e+02, C=4.00
- Fold09: degree=2, scale=1e+02, C=4.00
+ Fold09: degree=3, scale=1e+02, C=4.00
- Fold09: degree=3, scale=1e+02, C=4.00
+ Fold09: degree=1, scale=1e-03, C=8.00
- Fold09: degree=1, scale=1e-03, C=8.00
+ Fold09: degree=2, scale=1e-03, C=8.00
- Fold09: degree=2, scale=1e-03, C=8.00
+ Fold09: degree=3, scale=1e-03, C=8.00
- Fold09: degree=3, scale=1e-03, C=8.00
+ Fold09: degree=1, scale=1e-02, C=8.00
- Fold09: degree=1, scale=1e-02, C=8.00
+ Fold09: degree=2, scale=1e-02, C=8.00
- Fold09: degree=2, scale=1e-02, C=8.00
+ Fold09: degree=3, scale=1e-02, C=8.00
- Fold09: degree=3, scale=1e-02, C=8.00
+ Fold09: degree=1, scale=1e-01, C=8.00
- Fold09: degree=1, scale=1e-01, C=8.00
+ Fold09: degree=2, scale=1e-01, C=8.00
- Fold09: degree=2, scale=1e-01, C=8.00
+ Fold09: degree=3, scale=1e-01, C=8.00
- Fold09: degree=3, scale=1e-01, C=8.00
+ Fold09: degree=1, scale=1e+00, C=8.00
- Fold09: degree=1, scale=1e+00, C=8.00
+ Fold09: degree=2, scale=1e+00, C=8.00
- Fold09: degree=2, scale=1e+00, C=8.00
+ Fold09: degree=3, scale=1e+00, C=8.00
- Fold09: degree=3, scale=1e+00, C=8.00
+ Fold09: degree=1, scale=1e+01, C=8.00
- Fold09: degree=1, scale=1e+01, C=8.00
+ Fold09: degree=2, scale=1e+01, C=8.00
- Fold09: degree=2, scale=1e+01, C=8.00
+ Fold09: degree=3, scale=1e+01, C=8.00
- Fold09: degree=3, scale=1e+01, C=8.00
+ Fold09: degree=1, scale=1e+02, C=8.00
- Fold09: degree=1, scale=1e+02, C=8.00
+ Fold09: degree=2, scale=1e+02, C=8.00
- Fold09: degree=2, scale=1e+02, C=8.00
+ Fold09: degree=3, scale=1e+02, C=8.00
- Fold09: degree=3, scale=1e+02, C=8.00
+ Fold10: degree=1, scale=1e-03, C=0.25
- Fold10: degree=1, scale=1e-03, C=0.25
+ Fold10: degree=2, scale=1e-03, C=0.25
- Fold10: degree=2, scale=1e-03, C=0.25
+ Fold10: degree=3, scale=1e-03, C=0.25
- Fold10: degree=3, scale=1e-03, C=0.25
+ Fold10: degree=1, scale=1e-02, C=0.25

```

```

- Fold10: degree=1, scale=1e-02, C=0.25
+ Fold10: degree=2, scale=1e-02, C=0.25
- Fold10: degree=2, scale=1e-02, C=0.25
+ Fold10: degree=3, scale=1e-02, C=0.25
- Fold10: degree=3, scale=1e-02, C=0.25
+ Fold10: degree=1, scale=1e-01, C=0.25
- Fold10: degree=1, scale=1e-01, C=0.25
+ Fold10: degree=2, scale=1e-01, C=0.25
- Fold10: degree=2, scale=1e-01, C=0.25
+ Fold10: degree=3, scale=1e-01, C=0.25
- Fold10: degree=3, scale=1e-01, C=0.25
+ Fold10: degree=1, scale=1e+00, C=0.25
- Fold10: degree=1, scale=1e+00, C=0.25
+ Fold10: degree=2, scale=1e+00, C=0.25
- Fold10: degree=2, scale=1e+00, C=0.25
+ Fold10: degree=3, scale=1e+00, C=0.25
- Fold10: degree=3, scale=1e+00, C=0.25
+ Fold10: degree=1, scale=1e+01, C=0.25
- Fold10: degree=1, scale=1e+01, C=0.25
+ Fold10: degree=2, scale=1e+01, C=0.25
- Fold10: degree=2, scale=1e+01, C=0.25
+ Fold10: degree=3, scale=1e+01, C=0.25
- Fold10: degree=3, scale=1e+01, C=0.25
+ Fold10: degree=1, scale=1e+02, C=0.25
- Fold10: degree=1, scale=1e+02, C=0.25
+ Fold10: degree=2, scale=1e+02, C=0.25
- Fold10: degree=2, scale=1e+02, C=0.25
+ Fold10: degree=3, scale=1e+02, C=0.25
- Fold10: degree=3, scale=1e+02, C=0.25
+ Fold10: degree=1, scale=1e-03, C=0.50
- Fold10: degree=1, scale=1e-03, C=0.50
+ Fold10: degree=2, scale=1e-03, C=0.50
- Fold10: degree=2, scale=1e-03, C=0.50
+ Fold10: degree=3, scale=1e-03, C=0.50
- Fold10: degree=3, scale=1e-03, C=0.50
+ Fold10: degree=1, scale=1e-02, C=0.50
- Fold10: degree=1, scale=1e-02, C=0.50
+ Fold10: degree=2, scale=1e-02, C=0.50
- Fold10: degree=2, scale=1e-02, C=0.50
+ Fold10: degree=3, scale=1e-02, C=0.50
- Fold10: degree=3, scale=1e-02, C=0.50
+ Fold10: degree=1, scale=1e-01, C=0.50
- Fold10: degree=1, scale=1e-01, C=0.50
+ Fold10: degree=2, scale=1e-01, C=0.50
- Fold10: degree=2, scale=1e-01, C=0.50
+ Fold10: degree=3, scale=1e-01, C=0.50
- Fold10: degree=3, scale=1e-01, C=0.50
+ Fold10: degree=1, scale=1e+00, C=0.50
- Fold10: degree=1, scale=1e+00, C=0.50
+ Fold10: degree=2, scale=1e+00, C=0.50
- Fold10: degree=2, scale=1e+00, C=0.50
+ Fold10: degree=3, scale=1e+00, C=0.50
- Fold10: degree=3, scale=1e+00, C=0.50
+ Fold10: degree=1, scale=1e+01, C=0.50

```


- Fold10: degree=1, scale=1e+01, C=0.50
 + Fold10: degree=2, scale=1e+01, C=0.50
 - Fold10: degree=2, scale=1e+01, C=0.50
 + Fold10: degree=3, scale=1e+01, C=0.50
 - Fold10: degree=3, scale=1e+01, C=0.50
 + Fold10: degree=1, scale=1e+02, C=0.50
 - Fold10: degree=1, scale=1e+02, C=0.50
 + Fold10: degree=2, scale=1e+02, C=0.50
 - Fold10: degree=2, scale=1e+02, C=0.50
 + Fold10: degree=3, scale=1e+02, C=0.50
 - Fold10: degree=3, scale=1e+02, C=0.50
 + Fold10: degree=1, scale=1e-03, C=1.00
 - Fold10: degree=1, scale=1e-03, C=1.00
 + Fold10: degree=2, scale=1e-03, C=1.00
 - Fold10: degree=2, scale=1e-03, C=1.00
 + Fold10: degree=3, scale=1e-03, C=1.00
 - Fold10: degree=3, scale=1e-03, C=1.00
 + Fold10: degree=1, scale=1e-02, C=1.00
 - Fold10: degree=1, scale=1e-02, C=1.00
 + Fold10: degree=2, scale=1e-02, C=1.00
 - Fold10: degree=2, scale=1e-02, C=1.00
 + Fold10: degree=3, scale=1e-02, C=1.00
 - Fold10: degree=3, scale=1e-02, C=1.00
 + Fold10: degree=1, scale=1e-01, C=1.00
 - Fold10: degree=1, scale=1e-01, C=1.00
 + Fold10: degree=2, scale=1e-01, C=1.00
 - Fold10: degree=2, scale=1e-01, C=1.00
 + Fold10: degree=3, scale=1e-01, C=1.00
 - Fold10: degree=3, scale=1e-01, C=1.00
 + Fold10: degree=1, scale=1e+00, C=1.00
 - Fold10: degree=1, scale=1e+00, C=1.00
 + Fold10: degree=2, scale=1e+00, C=1.00
 - Fold10: degree=2, scale=1e+00, C=1.00
 + Fold10: degree=3, scale=1e+00, C=1.00
 - Fold10: degree=3, scale=1e+00, C=1.00
 + Fold10: degree=1, scale=1e+01, C=1.00
 - Fold10: degree=1, scale=1e+01, C=1.00
 + Fold10: degree=2, scale=1e+01, C=1.00
 - Fold10: degree=2, scale=1e+01, C=1.00
 + Fold10: degree=3, scale=1e+01, C=1.00
 - Fold10: degree=3, scale=1e+01, C=1.00
 + Fold10: degree=1, scale=1e+02, C=1.00
 - Fold10: degree=1, scale=1e+02, C=1.00
 + Fold10: degree=2, scale=1e+02, C=1.00
 - Fold10: degree=2, scale=1e+02, C=1.00
 + Fold10: degree=3, scale=1e+02, C=1.00
 - Fold10: degree=3, scale=1e+02, C=1.00
 + Fold10: degree=1, scale=1e-03, C=2.00
 - Fold10: degree=1, scale=1e-03, C=2.00
 + Fold10: degree=2, scale=1e-03, C=2.00
 - Fold10: degree=2, scale=1e-03, C=2.00
 + Fold10: degree=3, scale=1e-03, C=2.00
 - Fold10: degree=3, scale=1e-03, C=2.00
 + Fold10: degree=1, scale=1e-02, C=2.00

```

- Fold10: degree=1, scale=1e-02, C=2.00
+ Fold10: degree=2, scale=1e-02, C=2.00
- Fold10: degree=2, scale=1e-02, C=2.00
+ Fold10: degree=3, scale=1e-02, C=2.00
- Fold10: degree=3, scale=1e-02, C=2.00
+ Fold10: degree=1, scale=1e-01, C=2.00
- Fold10: degree=1, scale=1e-01, C=2.00
+ Fold10: degree=2, scale=1e-01, C=2.00
- Fold10: degree=2, scale=1e-01, C=2.00
+ Fold10: degree=3, scale=1e-01, C=2.00
- Fold10: degree=3, scale=1e-01, C=2.00
+ Fold10: degree=1, scale=1e+00, C=2.00
- Fold10: degree=1, scale=1e+00, C=2.00
+ Fold10: degree=2, scale=1e+00, C=2.00
- Fold10: degree=2, scale=1e+00, C=2.00
+ Fold10: degree=3, scale=1e+00, C=2.00
- Fold10: degree=3, scale=1e+00, C=2.00
+ Fold10: degree=1, scale=1e+01, C=2.00
- Fold10: degree=1, scale=1e+01, C=2.00
+ Fold10: degree=2, scale=1e+01, C=2.00
- Fold10: degree=2, scale=1e+01, C=2.00
+ Fold10: degree=3, scale=1e+01, C=2.00
- Fold10: degree=3, scale=1e+01, C=2.00
+ Fold10: degree=1, scale=1e+02, C=2.00
- Fold10: degree=1, scale=1e+02, C=2.00
+ Fold10: degree=2, scale=1e+02, C=2.00
- Fold10: degree=2, scale=1e+02, C=2.00
+ Fold10: degree=3, scale=1e+02, C=2.00
- Fold10: degree=3, scale=1e+02, C=2.00
+ Fold10: degree=1, scale=1e-03, C=4.00
- Fold10: degree=1, scale=1e-03, C=4.00
+ Fold10: degree=2, scale=1e-03, C=4.00
- Fold10: degree=2, scale=1e-03, C=4.00
+ Fold10: degree=3, scale=1e-03, C=4.00
- Fold10: degree=3, scale=1e-03, C=4.00
+ Fold10: degree=1, scale=1e-02, C=4.00
- Fold10: degree=1, scale=1e-02, C=4.00
+ Fold10: degree=2, scale=1e-02, C=4.00
- Fold10: degree=2, scale=1e-02, C=4.00
+ Fold10: degree=3, scale=1e-02, C=4.00
- Fold10: degree=3, scale=1e-02, C=4.00
+ Fold10: degree=1, scale=1e-01, C=4.00
- Fold10: degree=1, scale=1e-01, C=4.00
+ Fold10: degree=2, scale=1e-01, C=4.00
- Fold10: degree=2, scale=1e-01, C=4.00
+ Fold10: degree=3, scale=1e-01, C=4.00
- Fold10: degree=3, scale=1e-01, C=4.00
+ Fold10: degree=1, scale=1e+00, C=4.00
- Fold10: degree=1, scale=1e+00, C=4.00
+ Fold10: degree=2, scale=1e+00, C=4.00
- Fold10: degree=2, scale=1e+00, C=4.00
+ Fold10: degree=3, scale=1e+00, C=4.00
- Fold10: degree=3, scale=1e+00, C=4.00
+ Fold10: degree=1, scale=1e+01, C=4.00

```

```

- Fold10: degree=1, scale=1e+01, C=4.00
+ Fold10: degree=2, scale=1e+01, C=4.00
- Fold10: degree=2, scale=1e+01, C=4.00
+ Fold10: degree=3, scale=1e+01, C=4.00
- Fold10: degree=3, scale=1e+01, C=4.00
+ Fold10: degree=1, scale=1e+02, C=4.00
- Fold10: degree=1, scale=1e+02, C=4.00
+ Fold10: degree=2, scale=1e+02, C=4.00
- Fold10: degree=2, scale=1e+02, C=4.00
+ Fold10: degree=3, scale=1e+02, C=4.00
- Fold10: degree=3, scale=1e+02, C=4.00
+ Fold10: degree=1, scale=1e-03, C=8.00
- Fold10: degree=1, scale=1e-03, C=8.00
+ Fold10: degree=2, scale=1e-03, C=8.00
- Fold10: degree=2, scale=1e-03, C=8.00
+ Fold10: degree=3, scale=1e-03, C=8.00
- Fold10: degree=3, scale=1e-03, C=8.00
+ Fold10: degree=1, scale=1e-02, C=8.00
- Fold10: degree=1, scale=1e-02, C=8.00
+ Fold10: degree=2, scale=1e-02, C=8.00
- Fold10: degree=2, scale=1e-02, C=8.00
+ Fold10: degree=3, scale=1e-02, C=8.00
- Fold10: degree=3, scale=1e-02, C=8.00
+ Fold10: degree=1, scale=1e-01, C=8.00
- Fold10: degree=1, scale=1e-01, C=8.00
+ Fold10: degree=2, scale=1e-01, C=8.00
- Fold10: degree=2, scale=1e-01, C=8.00
+ Fold10: degree=3, scale=1e-01, C=8.00
- Fold10: degree=3, scale=1e-01, C=8.00
+ Fold10: degree=1, scale=1e+00, C=8.00
- Fold10: degree=1, scale=1e+00, C=8.00
+ Fold10: degree=2, scale=1e+00, C=8.00
- Fold10: degree=2, scale=1e+00, C=8.00
+ Fold10: degree=3, scale=1e+00, C=8.00
- Fold10: degree=3, scale=1e+00, C=8.00
+ Fold10: degree=1, scale=1e+01, C=8.00
- Fold10: degree=1, scale=1e+01, C=8.00
+ Fold10: degree=2, scale=1e+01, C=8.00
- Fold10: degree=2, scale=1e+01, C=8.00
+ Fold10: degree=3, scale=1e+01, C=8.00
- Fold10: degree=3, scale=1e+01, C=8.00
+ Fold10: degree=1, scale=1e+02, C=8.00
- Fold10: degree=1, scale=1e+02, C=8.00
+ Fold10: degree=2, scale=1e+02, C=8.00
- Fold10: degree=2, scale=1e+02, C=8.00
+ Fold10: degree=3, scale=1e+02, C=8.00
- Fold10: degree=3, scale=1e+02, C=8.00
Aggregating results
Selecting tuning parameters
Fitting degree = 3, scale = 0.01, C = 2 on full training set

Se grafican los desempeños de las distintas configuraciones probadas

```

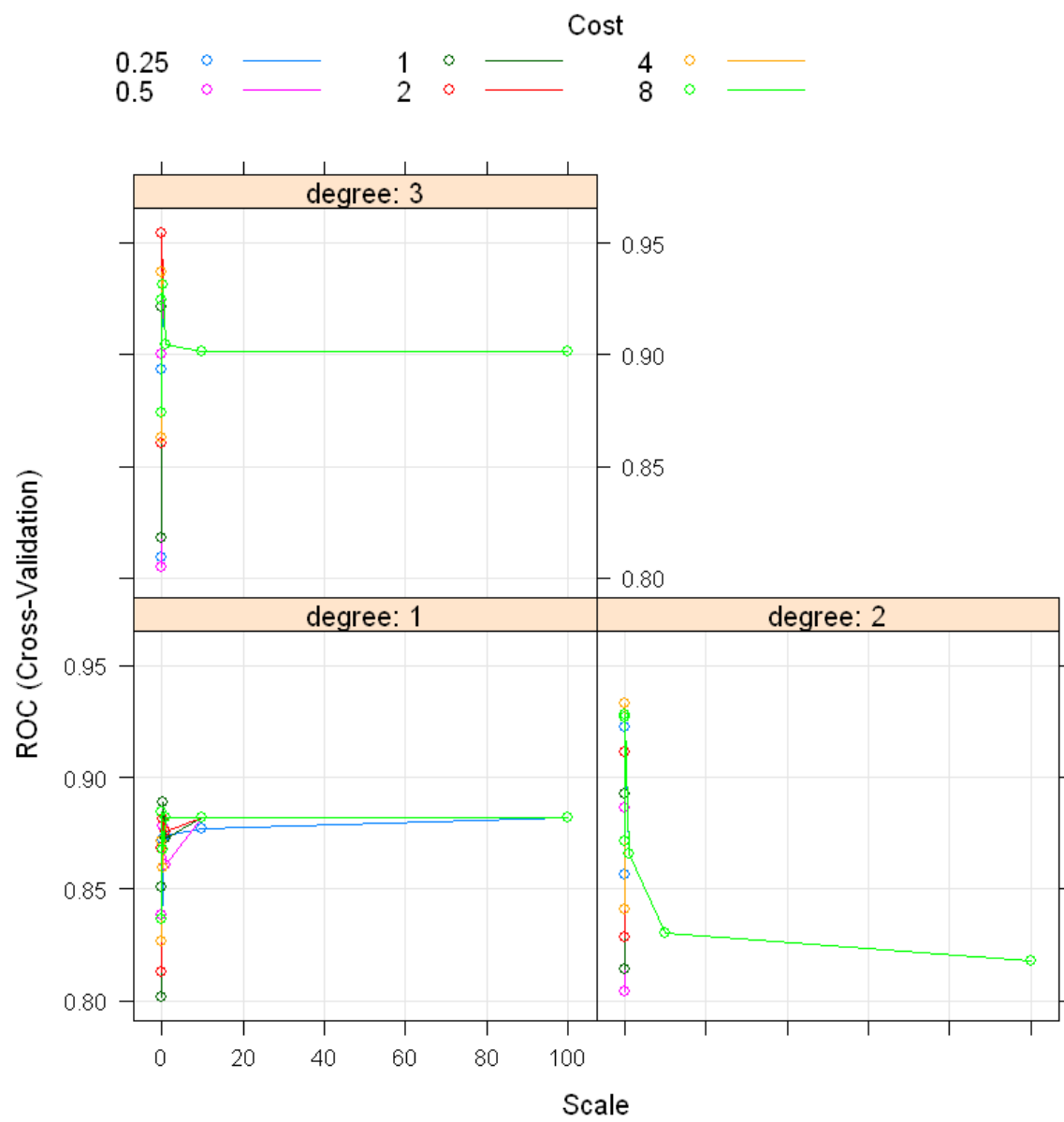


Figure 7: png

```
plot(model_SVM_AG)
```

Se imprime las métricas de las distintas combinaciones de parámetros

```
print(model_SVM_AG)
```

Support Vector Machines with Polynomial Kernel

```
146 samples
60 predictor
2 classes: 'M', 'R'
```

No pre-processing

Resampling: Cross-Validated (10 fold)

Summary of sample sizes: 131, 132, 131, 131, 131, 131, ...

Resampling results across tuning parameters:

degree	scale	C	ROC	Sens	Spec
1	1e-03	0.25	0.8016582	0.5250000	0.8547619
1	1e-03	0.50	0.8016582	0.5125000	0.8547619
1	1e-03	1.00	0.8016582	0.4750000	0.8547619
1	1e-03	2.00	0.8127551	0.7285714	0.7285714
1	1e-03	4.00	0.8265306	0.7285714	0.7000000
1	1e-03	8.00	0.8364371	0.7928571	0.7285714
1	1e-02	0.25	0.8130952	0.7553571	0.7142857
1	1e-02	0.50	0.8384354	0.7428571	0.7571429
1	1e-02	1.00	0.8507228	0.7678571	0.7285714
1	1e-02	2.00	0.8682398	0.7821429	0.7904762
1	1e-02	4.00	0.8711735	0.7964286	0.7928571
1	1e-02	8.00	0.8844813	0.8482143	0.7928571
1	1e-01	0.25	0.8718112	0.7964286	0.7904762
1	1e-01	0.50	0.8783163	0.8071429	0.8071429
1	1e-01	1.00	0.8886480	0.8482143	0.7904762
1	1e-01	2.00	0.8812500	0.8214286	0.8500000
1	1e-01	4.00	0.8595238	0.8107143	0.7595238
1	1e-01	8.00	0.8677721	0.7857143	0.7452381
1	1e+00	0.25	0.8741071	0.8232143	0.7738095
1	1e+00	0.50	0.8610119	0.7857143	0.7619048
1	1e+00	1.00	0.8725340	0.7839286	0.7428571
1	1e+00	2.00	0.8754677	0.7839286	0.7761905
1	1e+00	4.00	0.8819303	0.8339286	0.7452381
1	1e+00	8.00	0.8819303	0.8214286	0.7452381
1	1e+01	0.25	0.8772534	0.8339286	0.7619048
1	1e+01	0.50	0.8819303	0.8214286	0.7595238
1	1e+01	1.00	0.8819303	0.8214286	0.7452381
1	1e+01	2.00	0.8819303	0.8214286	0.7476190
1	1e+01	4.00	0.8819303	0.8339286	0.7476190
1	1e+01	8.00	0.8819303	0.8339286	0.7309524
1	1e+02	0.25	0.8819303	0.8589286	0.7000000
1	1e+02	0.50	0.8819303	0.8339286	0.7309524
1	1e+02	1.00	0.8819303	0.8339286	0.7285714
1	1e+02	2.00	0.8819303	0.8339286	0.7309524
1	1e+02	4.00	0.8819303	0.8339286	0.7476190
1	1e+02	8.00	0.8819303	0.8089286	0.7595238

2	1e-03	0.25	0.8040391	0.5125000	0.8547619
2	1e-03	0.50	0.8040391	0.5000000	0.8380952
2	1e-03	1.00	0.8142007	0.7303571	0.7285714
2	1e-03	2.00	0.8283163	0.7285714	0.7285714
2	1e-03	4.00	0.8406037	0.8196429	0.7285714
2	1e-03	8.00	0.8712160	0.7696429	0.7904762
2	1e-02	0.25	0.8562500	0.7803571	0.7738095
2	1e-02	0.50	0.8866071	0.8446429	0.7452381
2	1e-02	1.00	0.8928571	0.8589286	0.7904762
2	1e-02	2.00	0.9111820	0.8482143	0.8476190
2	1e-02	4.00	0.9331633	0.8714286	0.8476190
2	1e-02	8.00	0.9281463	0.8714286	0.8190476
2	1e-01	0.25	0.9227891	0.8857143	0.8333333
2	1e-01	0.50	0.9269558	0.8714286	0.8476190
2	1e-01	1.00	0.9269558	0.8839286	0.8333333
2	1e-01	2.00	0.9269558	0.8839286	0.8333333
2	1e-01	4.00	0.9269558	0.8982143	0.8333333
2	1e-01	8.00	0.9269558	0.8839286	0.8333333
2	1e+00	0.25	0.8659014	0.8464286	0.6571429
2	1e+00	0.50	0.8659014	0.8464286	0.6738095
2	1e+00	1.00	0.8659014	0.8464286	0.6738095
2	1e+00	2.00	0.8659014	0.8464286	0.6452381
2	1e+00	4.00	0.8659014	0.8339286	0.6738095
2	1e+00	8.00	0.8659014	0.8464286	0.6880952
2	1e+01	0.25	0.8303571	0.8071429	0.6452381
2	1e+01	0.50	0.8303571	0.7946429	0.6595238
2	1e+01	1.00	0.8303571	0.8321429	0.6452381
2	1e+01	2.00	0.8303571	0.7821429	0.6738095
2	1e+01	4.00	0.8303571	0.8071429	0.6595238
2	1e+01	8.00	0.8303571	0.7803571	0.6166667
2	1e+02	0.25	0.8176020	0.7678571	0.6595238
2	1e+02	0.50	0.8176020	0.7946429	0.6595238
2	1e+02	1.00	0.8176020	0.7678571	0.6595238
2	1e+02	2.00	0.8176020	0.7946429	0.6309524
2	1e+02	4.00	0.8176020	0.7821429	0.6738095
2	1e+02	8.00	0.8176020	0.7946429	0.6452381
3	1e-03	0.25	0.8093963	0.5142857	0.8547619
3	1e-03	0.50	0.8049320	0.5750000	0.8047619
3	1e-03	1.00	0.8178571	0.7303571	0.7142857
3	1e-03	2.00	0.8601616	0.7928571	0.7428571
3	1e-03	4.00	0.8629252	0.8071429	0.7619048
3	1e-03	8.00	0.8738946	0.8339286	0.8071429
3	1e-02	0.25	0.8933673	0.8464286	0.7904762
3	1e-02	0.50	0.9002126	0.8589286	0.8047619
3	1e-02	1.00	0.9210459	0.8714286	0.8047619
3	1e-02	2.00	0.9545918	0.9089286	0.8333333
3	1e-02	4.00	0.9367347	0.8964286	0.8190476
3	1e-02	8.00	0.9242347	0.8839286	0.8357143
3	1e-01	0.25	0.9312925	0.9089286	0.8071429
3	1e-01	0.50	0.9312925	0.9089286	0.8095238
3	1e-01	1.00	0.9312925	0.9214286	0.7738095
3	1e-01	2.00	0.9312925	0.9214286	0.7619048
3	1e-01	4.00	0.9312925	0.9089286	0.8666667
3	1e-01	8.00	0.9312925	0.8964286	0.8047619

3	1e+00	0.25	0.9043367	0.8839286	0.7761905
3	1e+00	0.50	0.9043367	0.9214286	0.7619048
3	1e+00	1.00	0.9043367	0.9232143	0.7595238
3	1e+00	2.00	0.9043367	0.9107143	0.7738095
3	1e+00	4.00	0.9043367	0.9107143	0.7738095
3	1e+00	8.00	0.9043367	0.9089286	0.7761905
3	1e+01	0.25	0.9013605	0.8964286	0.8357143
3	1e+01	0.50	0.9013605	0.8964286	0.8190476
3	1e+01	1.00	0.9013605	0.8714286	0.8214286
3	1e+01	2.00	0.9013605	0.8857143	0.7880952
3	1e+01	4.00	0.9013605	0.8964286	0.8214286
3	1e+01	8.00	0.9013605	0.8964286	0.8190476
3	1e+02	0.25	0.9013605	0.8982143	0.7738095
3	1e+02	0.50	0.9013605	0.9232143	0.7880952
3	1e+02	1.00	0.9013605	0.8964286	0.8190476
3	1e+02	2.00	0.9013605	0.8964286	0.8047619
3	1e+02	4.00	0.9013605	0.8964286	0.8357143
3	1e+02	8.00	0.9013605	0.9089286	0.7738095

ROC was used to select the optimal model using the largest value.

The final values used for the model were degree = 3, scale = 0.01 and C = 2.

La mejor configuración del modelo con automatic grid es **degree = 3, scale = 0.01 and C = 2**

```
model_SVM <- train(
  Class ~ ., training,
  method = "svmPoly",
  metric = "ROC",
  trControl = trainControl(
    method = "cv", number = 10,
    verboseIter = TRUE,
    summaryFunction = twoClassSummary,
    classProbs = TRUE
  )
)
```

```
+ Fold01: degree=1, scale=0.001, C=0.25
- Fold01: degree=1, scale=0.001, C=0.25
+ Fold01: degree=2, scale=0.001, C=0.25
- Fold01: degree=2, scale=0.001, C=0.25
+ Fold01: degree=3, scale=0.001, C=0.25
- Fold01: degree=3, scale=0.001, C=0.25
+ Fold01: degree=1, scale=0.010, C=0.25
- Fold01: degree=1, scale=0.010, C=0.25
+ Fold01: degree=2, scale=0.010, C=0.25
- Fold01: degree=2, scale=0.010, C=0.25
+ Fold01: degree=3, scale=0.010, C=0.25
- Fold01: degree=3, scale=0.010, C=0.25
+ Fold01: degree=1, scale=0.100, C=0.25
- Fold01: degree=1, scale=0.100, C=0.25
+ Fold01: degree=2, scale=0.100, C=0.25
- Fold01: degree=2, scale=0.100, C=0.25
+ Fold01: degree=3, scale=0.100, C=0.25
- Fold01: degree=3, scale=0.100, C=0.25
```


[illegible]


```

+ Fold09: degree=1, scale=0.001, C=0.50
- Fold09: degree=1, scale=0.001, C=0.50
+ Fold09: degree=2, scale=0.001, C=0.50
- Fold09: degree=2, scale=0.001, C=0.50
+ Fold09: degree=3, scale=0.001, C=0.50
- Fold09: degree=3, scale=0.001, C=0.50
+ Fold09: degree=1, scale=0.010, C=0.50
- Fold09: degree=1, scale=0.010, C=0.50
+ Fold09: degree=2, scale=0.010, C=0.50
- Fold09: degree=2, scale=0.010, C=0.50
+ Fold09: degree=3, scale=0.010, C=0.50
- Fold09: degree=3, scale=0.010, C=0.50
+ Fold09: degree=1, scale=0.100, C=0.50
- Fold09: degree=1, scale=0.100, C=0.50
+ Fold09: degree=2, scale=0.100, C=0.50
- Fold09: degree=2, scale=0.100, C=0.50
+ Fold09: degree=3, scale=0.100, C=0.50
- Fold09: degree=3, scale=0.100, C=0.50
+ Fold09: degree=1, scale=0.001, C=1.00
- Fold09: degree=1, scale=0.001, C=1.00
+ Fold09: degree=2, scale=0.001, C=1.00
- Fold09: degree=2, scale=0.001, C=1.00
+ Fold09: degree=3, scale=0.001, C=1.00
- Fold09: degree=3, scale=0.001, C=1.00
+ Fold09: degree=1, scale=0.010, C=1.00
- Fold09: degree=1, scale=0.010, C=1.00
+ Fold09: degree=2, scale=0.010, C=1.00
- Fold09: degree=2, scale=0.010, C=1.00
+ Fold09: degree=3, scale=0.010, C=1.00
- Fold09: degree=3, scale=0.010, C=1.00
+ Fold09: degree=1, scale=0.100, C=1.00
- Fold09: degree=1, scale=0.100, C=1.00
+ Fold09: degree=2, scale=0.100, C=1.00
- Fold09: degree=2, scale=0.100, C=1.00
+ Fold09: degree=3, scale=0.100, C=1.00
- Fold09: degree=3, scale=0.100, C=1.00
+ Fold10: degree=1, scale=0.001, C=0.25
- Fold10: degree=1, scale=0.001, C=0.25
+ Fold10: degree=2, scale=0.001, C=0.25
- Fold10: degree=2, scale=0.001, C=0.25
+ Fold10: degree=3, scale=0.001, C=0.25
- Fold10: degree=3, scale=0.001, C=0.25
+ Fold10: degree=1, scale=0.010, C=0.25
- Fold10: degree=1, scale=0.010, C=0.25
+ Fold10: degree=2, scale=0.010, C=0.25
- Fold10: degree=2, scale=0.010, C=0.25
+ Fold10: degree=3, scale=0.010, C=0.25
- Fold10: degree=3, scale=0.010, C=0.25
+ Fold10: degree=1, scale=0.100, C=0.25
- Fold10: degree=1, scale=0.100, C=0.25
+ Fold10: degree=2, scale=0.100, C=0.25
- Fold10: degree=2, scale=0.100, C=0.25
+ Fold10: degree=3, scale=0.100, C=0.25
- Fold10: degree=3, scale=0.100, C=0.25

```



```

+ Fold10: degree=1, scale=0.001, C=0.50
- Fold10: degree=1, scale=0.001, C=0.50
+ Fold10: degree=2, scale=0.001, C=0.50
- Fold10: degree=2, scale=0.001, C=0.50
+ Fold10: degree=3, scale=0.001, C=0.50
- Fold10: degree=3, scale=0.001, C=0.50
+ Fold10: degree=1, scale=0.010, C=0.50
- Fold10: degree=1, scale=0.010, C=0.50
+ Fold10: degree=2, scale=0.010, C=0.50
- Fold10: degree=2, scale=0.010, C=0.50
+ Fold10: degree=3, scale=0.010, C=0.50
- Fold10: degree=3, scale=0.010, C=0.50
+ Fold10: degree=1, scale=0.100, C=0.50
- Fold10: degree=1, scale=0.100, C=0.50
+ Fold10: degree=2, scale=0.100, C=0.50
- Fold10: degree=2, scale=0.100, C=0.50
+ Fold10: degree=3, scale=0.100, C=0.50
- Fold10: degree=3, scale=0.100, C=0.50
+ Fold10: degree=1, scale=0.001, C=1.00
- Fold10: degree=1, scale=0.001, C=1.00
+ Fold10: degree=2, scale=0.001, C=1.00
- Fold10: degree=2, scale=0.001, C=1.00
+ Fold10: degree=3, scale=0.001, C=1.00
- Fold10: degree=3, scale=0.001, C=1.00
+ Fold10: degree=1, scale=0.010, C=1.00
- Fold10: degree=1, scale=0.010, C=1.00
+ Fold10: degree=2, scale=0.010, C=1.00
- Fold10: degree=2, scale=0.010, C=1.00
+ Fold10: degree=3, scale=0.010, C=1.00
- Fold10: degree=3, scale=0.010, C=1.00
+ Fold10: degree=1, scale=0.100, C=1.00
- Fold10: degree=1, scale=0.100, C=1.00
+ Fold10: degree=2, scale=0.100, C=1.00
- Fold10: degree=2, scale=0.100, C=1.00
+ Fold10: degree=3, scale=0.100, C=1.00
- Fold10: degree=3, scale=0.100, C=1.00

```

Aggregating results

Selecting tuning parameters

Fitting degree = 2, scale = 0.1, C = 0.25 on full training set

```

#Aplicar el modelo en la base testing
print("MODELO NORMAL")
SVMprediction <-predict(model_SVM, testing)
cmSVM <-confusionMatrix(SVMprediction,testing$Class)
print(cmSVM)
print("MODELO CON AUTOMATIC GRID")
SVM_AG_predict <-predict(model_SVM_AG, testing)
cmSVM_AG1 <-confusionMatrix(SVM_AG_predict,testing$Class)
print(cmSVM_AG1)

```

```
[1] "MODELO NORMAL"
```

Confusion Matrix and Statistics

Reference

Prediction M R

M 29 6
R 4 23

Accuracy : 0.8387
95% CI : (0.7233, 0.9198)
No Information Rate : 0.5323
P-Value [Acc > NIR] : 3.903e-07

Kappa : 0.6747

Mcnemar's Test P-Value : 0.7518

Sensitivity : 0.8788
Specificity : 0.7931
Pos Pred Value : 0.8286
Neg Pred Value : 0.8519
Prevalence : 0.5323
Detection Rate : 0.4677
Detection Prevalence : 0.5645
Balanced Accuracy : 0.8359

'Positive' Class : M

[1] "MODELO CON AUTOMATIC GRID"
Confusion Matrix and Statistics

Reference
Prediction M R
M 30 6
R 3 23

Accuracy : 0.8548
95% CI : (0.7422, 0.9314)
No Information Rate : 0.5323
P-Value [Acc > NIR] : 8.133e-08

Kappa : 0.7066

Mcnemar's Test P-Value : 0.505

Sensitivity : 0.9091
Specificity : 0.7931
Pos Pred Value : 0.8333
Neg Pred Value : 0.8846
Prevalence : 0.5323
Detection Rate : 0.4839
Detection Prevalence : 0.5806
Balanced Accuracy : 0.8511

'Positive' Class : M

Como podemos notar el modelo con automatic grid tiene una mejor performance

MODELO DECISION TREE

- A diferencia del modelo SVM ahora compararemos dos modelos DT, uno sin GridSearch y uno con GridSearch
- Parametros del DT C50 son trials, model, winnow

Primero definimos los fold y las repeticiones del crossvalidation Usaremos el método **repeatedcv** que es un cross validation repetido segun la cantidad de **repeats** ingresadas.

```
Control_DT_c50 <- trainControl(method = "repeatedcv",
                               number = 10,
                               repeats = 3, verboseIter = TRUE,
                               summaryFunction = twoClassSummary,
                               classProbs = TRUE)
```

```
#Modelo DT Original
model_DT <- train(
  Class ~ ., training,
  method = "C5.0",
  metric = "ROC",
  trControl = trainControl(
    method = "cv", number = 10,
    verboseIter = TRUE,
    summaryFunction = twoClassSummary,
    classProbs = TRUE))
```

```
#Modelo DT con GridSearch
model_DT_1 <- train(
  Class ~ ., training,
  method = "C5.0",
  trControl = Control_DT_c50,
  tuneLength = 10,
  metric = "ROC")
```

```
+ Fold01: model=tree, winnow=FALSE, trials=20
- Fold01: model=tree, winnow=FALSE, trials=20
+ Fold01: model=tree, winnow= TRUE, trials=20
```

Warning message:

```
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"Warning message:
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"
```

```
- Fold01: model=tree, winnow= TRUE, trials=20
+ Fold01: model=rules, winnow=FALSE, trials=20
- Fold01: model=rules, winnow=FALSE, trials=20
+ Fold01: model=rules, winnow= TRUE, trials=20
```

Warning message:

```
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"Warning message:
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"
```

```
- Fold01: model=rules, winnow= TRUE, trials=20
+ Fold02: model=tree, winnow=FALSE, trials=20
```

Warning message:

"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"

- Fold02: model=tree, winnow=FALSE, trials=20
+ Fold02: model=tree, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 8 for this object. Predictions generated using 8 trials"Warning message:
"'trials' should be <= 8 for this object. Predictions generated using 8 trials"

- Fold02: model=tree, winnow= TRUE, trials=20
+ Fold02: model=rules, winnow=FALSE, trials=20
- Fold02: model=rules, winnow=FALSE, trials=20
+ Fold02: model=rules, winnow= TRUE, trials=20
- Fold02: model=rules, winnow= TRUE, trials=20
+ Fold03: model=tree, winnow=FALSE, trials=20
- Fold03: model=tree, winnow=FALSE, trials=20
+ Fold03: model=tree, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 3 for this object. Predictions generated using 3 trials"Warning message:
"'trials' should be <= 3 for this object. Predictions generated using 3 trials"

- Fold03: model=tree, winnow= TRUE, trials=20
+ Fold03: model=rules, winnow=FALSE, trials=20
- Fold03: model=rules, winnow=FALSE, trials=20
+ Fold03: model=rules, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 3 for this object. Predictions generated using 3 trials"Warning message:
"'trials' should be <= 3 for this object. Predictions generated using 3 trials"

- Fold03: model=rules, winnow= TRUE, trials=20
+ Fold04: model=tree, winnow=FALSE, trials=20
- Fold04: model=tree, winnow=FALSE, trials=20
+ Fold04: model=tree, winnow= TRUE, trials=20
- Fold04: model=tree, winnow= TRUE, trials=20
+ Fold04: model=rules, winnow=FALSE, trials=20
- Fold04: model=rules, winnow=FALSE, trials=20
+ Fold04: model=rules, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 5 for this object. Predictions generated using 5 trials"Warning message:
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"

- Fold04: model=rules, winnow= TRUE, trials=20
+ Fold05: model=tree, winnow=FALSE, trials=20

- Fold05: model=tree, winnow=FALSE, trials=20
+ Fold05: model=tree, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 9 for this object. Predictions generated using 9 trials"Warning message:
"'trials' should be <= 9 for this object. Predictions generated using 9 trials"

- Fold05: model=tree, winnow= TRUE, trials=20
+ Fold05: model=rules, winnow=FALSE, trials=20
- Fold05: model=rules, winnow=FALSE, trials=20
+ Fold05: model=rules, winnow= TRUE, trials=20
- Fold05: model=rules, winnow= TRUE, trials=20
+ Fold06: model=tree, winnow=FALSE, trials=20
- Fold06: model=tree, winnow=FALSE, trials=20
+ Fold06: model=tree, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"

- Fold06: model=tree, winnow= TRUE, trials=20
+ Fold06: model=rules, winnow=FALSE, trials=20
- Fold06: model=rules, winnow=FALSE, trials=20
+ Fold06: model=rules, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"

- Fold06: model=rules, winnow= TRUE, trials=20
+ Fold07: model=tree, winnow=FALSE, trials=20
- Fold07: model=tree, winnow=FALSE, trials=20
+ Fold07: model=tree, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"

- Fold07: model=tree, winnow= TRUE, trials=20
+ Fold07: model=rules, winnow=FALSE, trials=20
- Fold07: model=rules, winnow=FALSE, trials=20
+ Fold07: model=rules, winnow= TRUE, trials=20

Warning message:

"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"

- Fold07: model=rules, winnow= TRUE, trials=20
+ Fold08: model=tree, winnow=FALSE, trials=20

```

- Fold08: model=tree, winnow=FALSE, trials=20
+ Fold08: model=tree, winnow= TRUE, trials=20
- Fold08: model=tree, winnow= TRUE, trials=20
+ Fold08: model=rules, winnow=FALSE, trials=20
- Fold08: model=rules, winnow=FALSE, trials=20
+ Fold08: model=rules, winnow= TRUE, trials=20
- Fold08: model=rules, winnow= TRUE, trials=20
+ Fold09: model=tree, winnow=FALSE, trials=20
- Fold09: model=tree, winnow=FALSE, trials=20
+ Fold09: model=tree, winnow= TRUE, trials=20

```

Warning message:

```

"'trials' should be <= 5 for this object. Predictions generated using 5 trials"Warning message:
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"

```

```

- Fold09: model=tree, winnow= TRUE, trials=20
+ Fold09: model=rules, winnow=FALSE, trials=20
- Fold09: model=rules, winnow=FALSE, trials=20
+ Fold09: model=rules, winnow= TRUE, trials=20

```

Warning message:

```

"'trials' should be <= 5 for this object. Predictions generated using 5 trials"Warning message:
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"

```

```

- Fold09: model=rules, winnow= TRUE, trials=20
+ Fold10: model=tree, winnow=FALSE, trials=20
- Fold10: model=tree, winnow=FALSE, trials=20
+ Fold10: model=tree, winnow= TRUE, trials=20

```

Warning message:

```

"'trials' should be <= 3 for this object. Predictions generated using 3 trials"Warning message:
"'trials' should be <= 3 for this object. Predictions generated using 3 trials"

```

```

- Fold10: model=tree, winnow= TRUE, trials=20
+ Fold10: model=rules, winnow=FALSE, trials=20
- Fold10: model=rules, winnow=FALSE, trials=20
+ Fold10: model=rules, winnow= TRUE, trials=20

```

Warning message:

```

"'trials' should be <= 3 for this object. Predictions generated using 3 trials"Warning message:
"'trials' should be <= 3 for this object. Predictions generated using 3 trials"

```

```

- Fold10: model=rules, winnow= TRUE, trials=20

```

Aggregating results

Selecting tuning parameters

Fitting trials = 10, model = tree, winnow = FALSE on full training set

```

+ Fold01.Rep1: model=tree, winnow=FALSE, trials=90
- Fold01.Rep1: model=tree, winnow=FALSE, trials=90
+ Fold01.Rep1: model=tree, winnow= TRUE, trials=90

```


[illegible]

Warning message:

```
- Fold03.Rep1: model=rules, winnow= TRUE, trials=90
+ Fold04.Rep1: model=tree, winnow=FALSE, trials=90
- Fold04.Rep1: model=tree, winnow=FALSE, trials=90
+ Fold04.Rep1: model=tree, winnow= TRUE, trials=90
```

[illegible]

```
+ Fold04.Rep1: model=rules, winnow=FALSE, trials=90
- Fold04.Rep1: model=rules, winnow=FALSE, trials=90
+ Fold04.Rep1: model=rules, winnow= TRUE, trials=90
```

[illegible]

Warning message:

```
- Fold05.Rep1: model=tree, winnow= TRUE, trials=90
+ Fold05.Rep1: model=rules, winnow=FALSE, trials=90
- Fold05.Rep1: model=rules, winnow=FALSE, trials=90
+ Fold05.Rep1: model=rules, winnow= TRUE, trials=90
```


[illegible]

```
- Fold09.Rep1: model=tree, winnow= TRUE, trials=90
+ Fold09.Rep1: model=rules, winnow=FALSE, trials=90
- Fold09.Rep1: model=rules, winnow=FALSE, trials=90
+ Fold09.Rep1: model=rules, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold09.Rep1: model=rules, winnow= TRUE, trials=90
+ Fold10.Rep1: model=tree, winnow=FALSE, trials=90
- Fold10.Rep1: model=tree, winnow=FALSE, trials=90
+ Fold10.Rep1: model=tree, winnow= TRUE, trials=90
```

Warning message:

[illegible]

[illegible]

Warning message:

```
- Fold10.Rep1: model=rules, winnow= TRUE, trials=90
+ Fold01.Rep2: model=tree, winnow=FALSE, trials=90
- Fold01.Rep2: model=tree, winnow=FALSE, trials=90
+ Fold01.Rep2: model=tree, winnow= TRUE, trials=90
```

```
- Fold01.Rep2: model=tree, winnow= TRUE, trials=90
+ Fold01.Rep2: model=rules, winnow=FALSE, trials=90
- Fold01.Rep2: model=rules, winnow=FALSE, trials=90
+ Fold01.Rep2: model=rules, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold01.Rep2: model=rules, winnow= TRUE, trials=90
+ Fold02.Rep2: model=tree, winnow=FALSE, trials=90
- Fold02.Rep2: model=tree, winnow=FALSE, trials=90
+ Fold02.Rep2: model=tree, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold02.Rep2: model=tree, winnow= TRUE, trials=90
+ Fold02.Rep2: model=rules, winnow=FALSE, trials=90
- Fold02.Rep2: model=rules, winnow=FALSE, trials=90
+ Fold02.Rep2: model=rules, winnow= TRUE, trials=90
```


[illegible]

```
- Fold03.Rep2: model=rules, winnow= TRUE, trials=90
+ Fold04.Rep2: model=tree, winnow=FALSE, trials=90
- Fold04.Rep2: model=tree, winnow=FALSE, trials=90
+ Fold04.Rep2: model=tree, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold04.Rep2: model=tree, winnow= TRUE, trials=90
+ Fold04.Rep2: model=rules, winnow=FALSE, trials=90
- Fold04.Rep2: model=rules, winnow=FALSE, trials=90
+ Fold04.Rep2: model=rules, winnow= TRUE, trials=90
```

Warning message:

[illegible]


```
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"Warning message:
"'trials' should be <= 5 for this object. Predictions generated using 5 trials"
```

```
- Fold09.Rep2: model=tree, winnow= TRUE, trials=90
+ Fold09.Rep2: model=rules, winnow=FALSE, trials=90
- Fold09.Rep2: model=rules, winnow=FALSE, trials=90
+ Fold09.Rep2: model=rules, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold09.Rep2: model=rules, winnow= TRUE, trials=90
+ Fold10.Rep2: model=tree, winnow=FALSE, trials=90
- Fold10.Rep2: model=tree, winnow=FALSE, trials=90
+ Fold10.Rep2: model=tree, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold10.Rep2: model=tree, winnow= TRUE, trials=90
+ Fold10.Rep2: model=rules, winnow=FALSE, trials=90
- Fold10.Rep2: model=rules, winnow=FALSE, trials=90
+ Fold10.Rep2: model=rules, winnow= TRUE, trials=90
```



```
"'trials' should be <= 6 for this object. Predictions generated using 6 trials"Warning message:
"'trials' should be <= 6 for this object. Predictions generated using 6 trials"Warning message:
"'trials' should be <= 6 for this object. Predictions generated using 6 trials"Warning message:
"'trials' should be <= 6 for this object. Predictions generated using 6 trials"
```

Warning message:

```
- Fold02.Rep3: model=tree, winnow= TRUE, trials=90
+ Fold02.Rep3: model=rules, winnow=FALSE, trials=90
- Fold02.Rep3: model=rules, winnow=FALSE, trials=90
+ Fold02.Rep3: model=rules, winnow= TRUE, trials=90
```

[illegible]

```
+ Fold03.Rep3: model=tree, winnow=FALSE, trials=90
- Fold03.Rep3: model=tree, winnow=FALSE, trials=90
+ Fold03.Rep3: model=tree, winnow= TRUE, trials=90
```

[illegible]

Warning message:

```
- Fold03.Rep3: model=rules, winnow= TRUE, trials=90
+ Fold04.Rep3: model=tree, winnow=FALSE, trials=90
- Fold04.Rep3: model=tree, winnow=FALSE, trials=90
+ Fold04.Rep3: model=tree, winnow= TRUE, trials=90
```

```
"'trials' should be <= 4 for this object. Predictions generated using 4 trials"Warning message:
"'trials' should be <= 4 for this object. Predictions generated using 4 trials"Warning message:
"'trials' should be <= 4 for this object. Predictions generated using 4 trials"Warning message:
"'trials' should be <= 4 for this object. Predictions generated using 4 trials"Warning message:
```

[illegible]

Warning message:

```
- Fold04.Rep3: model=rules, winnow= TRUE, trials=90
+ Fold05.Rep3: model=tree, winnow=FALSE, trials=90
- Fold05.Rep3: model=tree, winnow=FALSE, trials=90
+ Fold05.Rep3: model=tree, winnow= TRUE, trials=90
```



```
+ Fold06.Rep3: model=rules, winnow=FALSE, trials=90
- Fold06.Rep3: model=rules, winnow=FALSE, trials=90
+ Fold06.Rep3: model=rules, winnow= TRUE, trials=90
```

[illegible]

Warning message:

```
- Fold07.Rep3: model=tree, winnow= TRUE, trials=90
+ Fold07.Rep3: model=rules, winnow=FALSE, trials=90
- Fold07.Rep3: model=rules, winnow=FALSE, trials=90
+ Fold07.Rep3: model=rules, winnow= TRUE, trials=90
```


[illegible]

Warning message:

```
- Fold09.Rep3: model=tree, winnow= TRUE, trials=90
+ Fold09.Rep3: model=rules, winnow=FALSE, trials=90
- Fold09.Rep3: model=rules, winnow=FALSE, trials=90
+ Fold09.Rep3: model=rules, winnow= TRUE, trials=90
```

```
- Fold09.Rep3: model=rules, winnow= TRUE, trials=90
+ Fold10.Rep3: model=tree, winnow=FALSE, trials=90
- Fold10.Rep3: model=tree, winnow=FALSE, trials=90
+ Fold10.Rep3: model=tree, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold10.Rep3: model=tree, winnow= TRUE, trials=90
+ Fold10.Rep3: model=rules, winnow=FALSE, trials=90
- Fold10.Rep3: model=rules, winnow=FALSE, trials=90
+ Fold10.Rep3: model=rules, winnow= TRUE, trials=90
```

Warning message:

[illegible]

```
- Fold10.Rep3: model=rules, winnow= TRUE, trials=90
```

Aggregating results

Selecting tuning parameters

Fitting trials = 30, model = tree, winnow = FALSE on full training set


```

print("MODELO ORIGINAL")
DTprediction <-predict(model_DT, testing)
cmDT <-confusionMatrix(DTprediction,testing$Class)
print(cmDT)
print("MODELO CON AUTOMATIC GRID")
DTprediction_GD <-predict(model_DT_1, testing)
cmDT_GD <-confusionMatrix(DTprediction_GD,testing$Class)
print(cmDT_GD)

```

```

[1] "MODELO ORIGINAL"
Confusion Matrix and Statistics

```

```

          Reference
Prediction M  R
          M 27  6
          R  6 23

      Accuracy : 0.8065
      95% CI   : (0.6863, 0.8958)
No Information Rate : 0.5323
P-Value [Acc > NIR] : 6.468e-06

      Kappa : 0.6113

Mcnemar's Test P-Value : 1

      Sensitivity : 0.8182
      Specificity : 0.7931
      Pos Pred Value : 0.8182
      Neg Pred Value : 0.7931
      Prevalence : 0.5323
      Detection Rate : 0.4355
      Detection Prevalence : 0.5323
      Balanced Accuracy : 0.8056

      'Positive' Class : M

```

```

[1] "MODELO CON AUTOMATIC GRID"
Confusion Matrix and Statistics

```

```

          Reference
Prediction M  R
          M 29  7
          R  4 22

      Accuracy : 0.8226
      95% CI   : (0.7047, 0.908)
No Information Rate : 0.5323
P-Value [Acc > NIR] : 1.674e-06

      Kappa : 0.6414

Mcnemar's Test P-Value : 0.5465

```

```

      Sensitivity : 0.8788
      Specificity : 0.7586
      Pos Pred Value : 0.8056
      Neg Pred Value : 0.8462
      Prevalence : 0.5323
      Detection Rate : 0.4677
      Detection Prevalence : 0.5806
      Balanced Accuracy : 0.8187

      'Positive' Class : M

```

Podemos notar que el modelo con automitcgrid tiene una mejor performance

Segunda opción es Grid Search: Manual Grid

- La segunda forma de buscar parámetros de algoritmo es especificar una grilla de sintonización manualmente.
- En la grilla cada parámetro del algoritmo se puede especificar como un vector de posibles valores.
- Estos vectores se combinan para definir todas las combinaciones posibles para probar.

```

#primero definimos los fold y las repeticiones del crossvalidation
Control_DT_c50 <- trainControl(method = "repeatedcv",
                               number = 10,
                               repeats = 3, verboseIter = FALSE,
                               summaryFunction = twoClassSummary,
                               classProbs = TRUE)

#Segundo definimos la grilla mediante vectores

grid_DT <- expand.grid( .winnow = c(TRUE,FALSE), .trials=c(7,15,17,18,20), .model="tree" )

model_DT_2 <- train(
  Class ~ ., training,
  tuneGrid=grid_DT,
  method = "C5.0",
  metric = "ROC",
  trControl = Control_DT_c50)

```

Warning message:

```

"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 1 for this object. Predictions generated using 1 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:
"'trials' should be <= 7 for this object. Predictions generated using 7 trials"Warning message:

```

[illegible]

[illegible]

[illegible]


```
TRUE    20      0.7466128  0.7261905  0.6674603
```

Tuning parameter 'model' was held constant at a value of tree
ROC was used to select the optimal model using the largest value.
The final values used for the model were trials = 17, model = tree and winnow
= FALSE.

El método de manualGrid obtiene mejores resultados que el modelo normal, pero requiere de ir probando valores para ir acotando el resultado

```
print("MODELO ORIGINAL")
print(cmDT)
print("MODELO MANUAL GRID")
DTprediction_MG <-predict(model_DT_2, testing)
cmDT_MG <-confusionMatrix(DTprediction_MG,testing$Class)
print(cmDT_MG)
```

```
[1] "MODELO ORIGINAL"
Confusion Matrix and Statistics
```

```

      Reference
Prediction M  R
      M 27  6
      R  6 23

      Accuracy : 0.8065
      95% CI : (0.6863, 0.8958)
No Information Rate : 0.5323
P-Value [Acc > NIR] : 6.468e-06

      Kappa : 0.6113

McNemar's Test P-Value : 1

      Sensitivity : 0.8182
      Specificity : 0.7931
      Pos Pred Value : 0.8182
      Neg Pred Value : 0.7931
      Prevalence : 0.5323
      Detection Rate : 0.4355
      Detection Prevalence : 0.5323
      Balanced Accuracy : 0.8056

      'Positive' Class : M
```

```
[1] "MODELO MANUAL GRID"
Confusion Matrix and Statistics
```

```

      Reference
Prediction M  R
      M 28  6
      R  5 23

      Accuracy : 0.8226
      95% CI : (0.7047, 0.908)
```

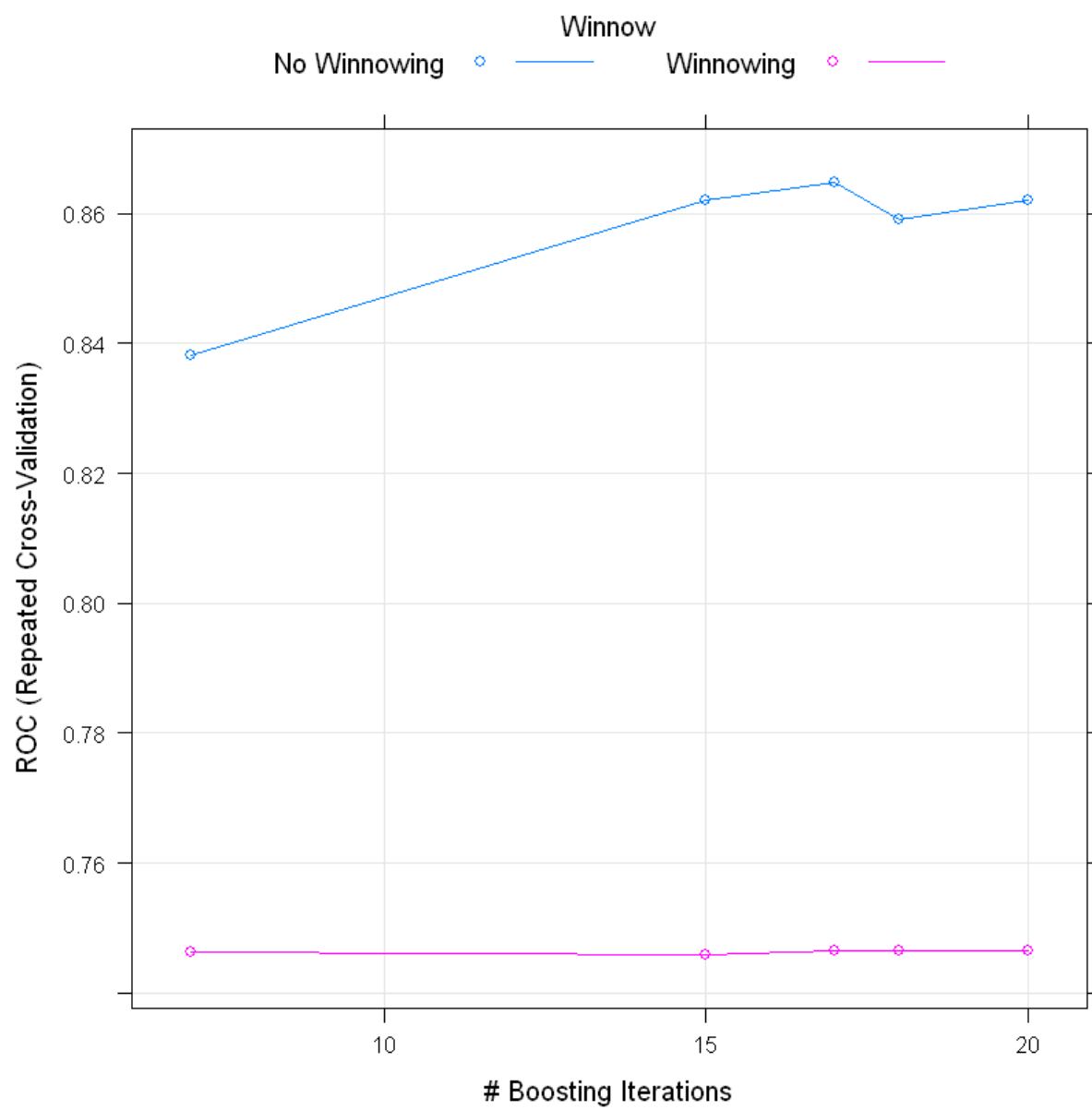


Figure 8: png

No Information Rate : 0.5323
P-Value [Acc > NIR] : 1.674e-06

Kappa : 0.6429

McNemar's Test P-Value : 1

Sensitivity : 0.8485
Specificity : 0.7931
Pos Pred Value : 0.8235
Neg Pred Value : 0.8214
Prevalence : 0.5323
Detection Rate : 0.4516
Detection Prevalence : 0.5484
Balanced Accuracy : 0.8208

'Positive' Class : M

RANDOM FOREST

El siguiente Random Forest tiene 2 hiperparámetros para configurar: - mtry: Número de variables muestreadas al azar como candidatos en cada división. - ntrees: Número de árboles para crecer que viene definido por default en 500

Cargamos la librería para el modelo

```
#install.packages("randomForest")
library(randomForest)

#Definimos la configuración de entrenamiento como un cross validation 10 fold con 3 repeticiones
control_rf <- trainControl(method="repeatedcv", number=10, repeats=3, summaryFunction = twoClassSummary,
                           classProbs = TRUE)
# definimos los valores para mtry seran del 1 al 20
grid_rf <- expand.grid(.mtry=c(1:20))
rf <- train(Class~., data=training, method="rf", metric="ROC", tuneGrid=grid_rf, trControl=control_rf)
print(rf)
plot(rf)
```

Random Forest

146 samples
60 predictor
2 classes: 'M', 'R'

No pre-processing

Resampling: Cross-Validated (10 fold, repeated 3 times)

Summary of sample sizes: 131, 131, 132, 132, 131, 132, ...

Resampling results across tuning parameters:

mtry	ROC	Sens	Spec
1	0.9303005	0.9065476	0.7174603
2	0.9355726	0.8982143	0.7603175
3	0.9332625	0.8815476	0.7555556
4	0.9266156	0.8773810	0.7404762

5	0.9290604	0.8732143	0.7452381
6	0.9267574	0.8726190	0.7555556
7	0.9214994	0.8732143	0.7555556
8	0.9287273	0.8684524	0.7603175
9	0.9147109	0.8690476	0.7507937
10	0.9226190	0.8773810	0.7547619
11	0.9071854	0.8553571	0.7595238
12	0.9120465	0.8553571	0.7460317
13	0.9195011	0.8607143	0.7603175
14	0.9090774	0.8684524	0.7603175
15	0.8998937	0.8690476	0.7595238
16	0.9031817	0.8559524	0.7500000
17	0.9062642	0.8684524	0.7404762
18	0.9036139	0.8553571	0.7595238
19	0.9059099	0.8559524	0.7349206
20	0.8981293	0.8553571	0.7349206

ROC was used to select the optimal model using the largest value.
The final value used for the model was mtry = 2.

El numero óptimo para mtry es 2

Configuración del ntree

```
#Definimos la configuración de entrenamiento como un cross validation 10 fold sin repeticiones
control_rf_2 <- trainControl(method="cv", number=10, summaryFunction = twoClassSummary,
                             classProbs = TRUE)

# definimos los valores para mtry seran del 1 al 20
rf_grid2 <- expand.grid(.mtry=c(1:20))

#creamos una lista vacia para ir guardando los distintos modelos
rf_list <- list()

# mediante un loop vamos probando los distintos valores de ntree.
## estos van desde el 100 al 500 cada 50. Es decir 100 - 150 - 200 - 250 .....- 400 - 450 - 500
for (i in seq(200, 600, by = 50)) {
  set.seed(1)
  rf4 <- train(Class ~.,
               data = training,
               method = "rf",
               metric = "ROC",
               tuneGrid = rf_grid2,
               ntree = i,
               trControl = control_rf_2)
  key <- toString(i)
  rf_list[[key]] <- rf4
}
```

Comparamos los resultados

```
bosques <- resamples(rf_list)
summary(bosques)
```

Call:

```
summary.resamples(object = bosques)
```

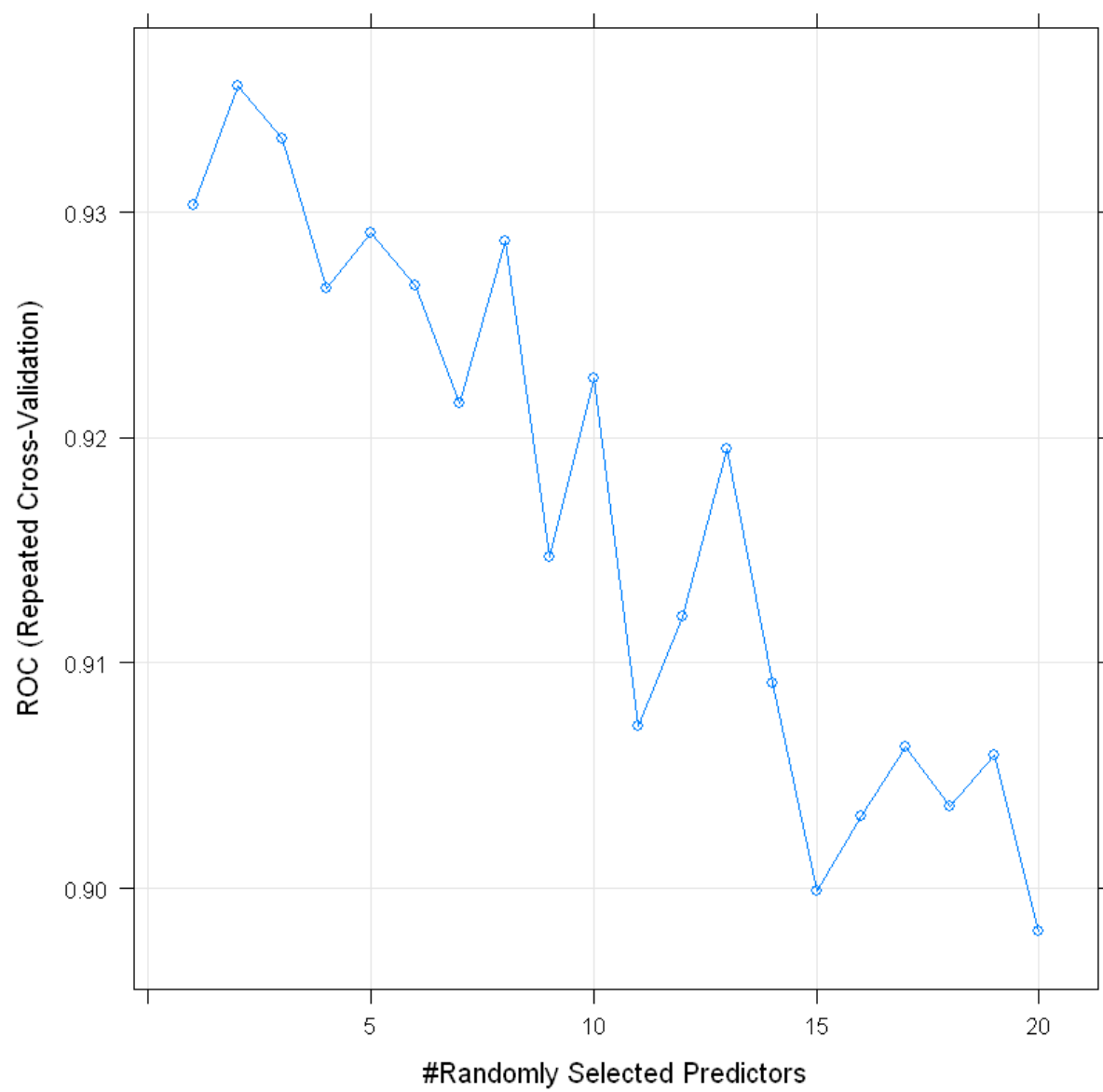


Figure 9: png

Models: 200, 250, 300, 350, 400, 450, 500, 550, 600
 Number of resamples: 10

ROC

	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.	NA's
200	0.7500000	0.9183673	0.9375000	0.9289116	0.9813988	1	0
250	0.8214286	0.8973214	0.9136905	0.9250425	0.9794855	1	0
300	0.7678571	0.8921131	0.9336735	0.9249150	0.9741709	1	0
350	0.7500000	0.9129464	0.9808673	0.9339711	0.9955357	1	0
400	0.7500000	0.9129464	0.9808673	0.9339711	0.9955357	1	0
450	0.7500000	0.9151786	0.9808673	0.9366497	0.9955357	1	0
500	0.7500000	0.9167730	0.9808673	0.9346088	0.9821429	1	0
550	0.7500000	0.9167730	0.9808673	0.9355017	0.9821429	1	0
600	0.7500000	0.9084821	0.9795918	0.9301446	0.9821429	1	0

Sens

	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.	NA's
200	0.500	0.8750000	0.9375	0.8982143	1.000	1	0
250	0.625	0.8616071	0.8750	0.8571429	0.875	1	0
300	0.625	0.7767857	0.8750	0.8446429	0.875	1	0
350	0.750	0.8750000	0.9375	0.9125000	1.000	1	0
400	0.750	0.8750000	0.9375	0.9125000	1.000	1	0
450	0.750	0.8750000	1.0000	0.9250000	1.000	1	0
500	0.750	0.8750000	1.0000	0.9250000	1.000	1	0
550	0.750	0.8616071	0.9375	0.9107143	1.000	1	0
600	0.750	0.8616071	0.8750	0.8982143	1.000	1	0

Spec

	Min.	1st Qu.	Median	Mean	3rd Qu.	Max.	NA's
200	0.5714286	0.5952381	0.7142857	0.7214286	0.8511905	0.8571429	0
250	0.6666667	0.7142857	0.7142857	0.7642857	0.8511905	0.8571429	0
300	0.5714286	0.5952381	0.7738095	0.7357143	0.8571429	0.8571429	0
350	0.4285714	0.6785714	0.7142857	0.7380952	0.8571429	1.0000000	0
400	0.5714286	0.5952381	0.7142857	0.7071429	0.8035714	0.8571429	0
450	0.4285714	0.5952381	0.7142857	0.6928571	0.8035714	0.8571429	0
500	0.4285714	0.5952381	0.7142857	0.7071429	0.8511905	0.8571429	0
550	0.4285714	0.5952381	0.7142857	0.7071429	0.8511905	0.8571429	0
600	0.4285714	0.5952381	0.7142857	0.6928571	0.8035714	0.8571429	0

```
dotplot(results)
```

Podemos notar que el mejor resultado ROC lo tiene el **ntree = 500**

Ahora a partir de **ntree =500** buscamos el óptimo para **mtry**

```
rf_list$`500`$bestTune
```

A data.frame: 1 × 1

```
mtry
```

```
<int>
```

```
1
```

Lista de los resultados para el ntree=500

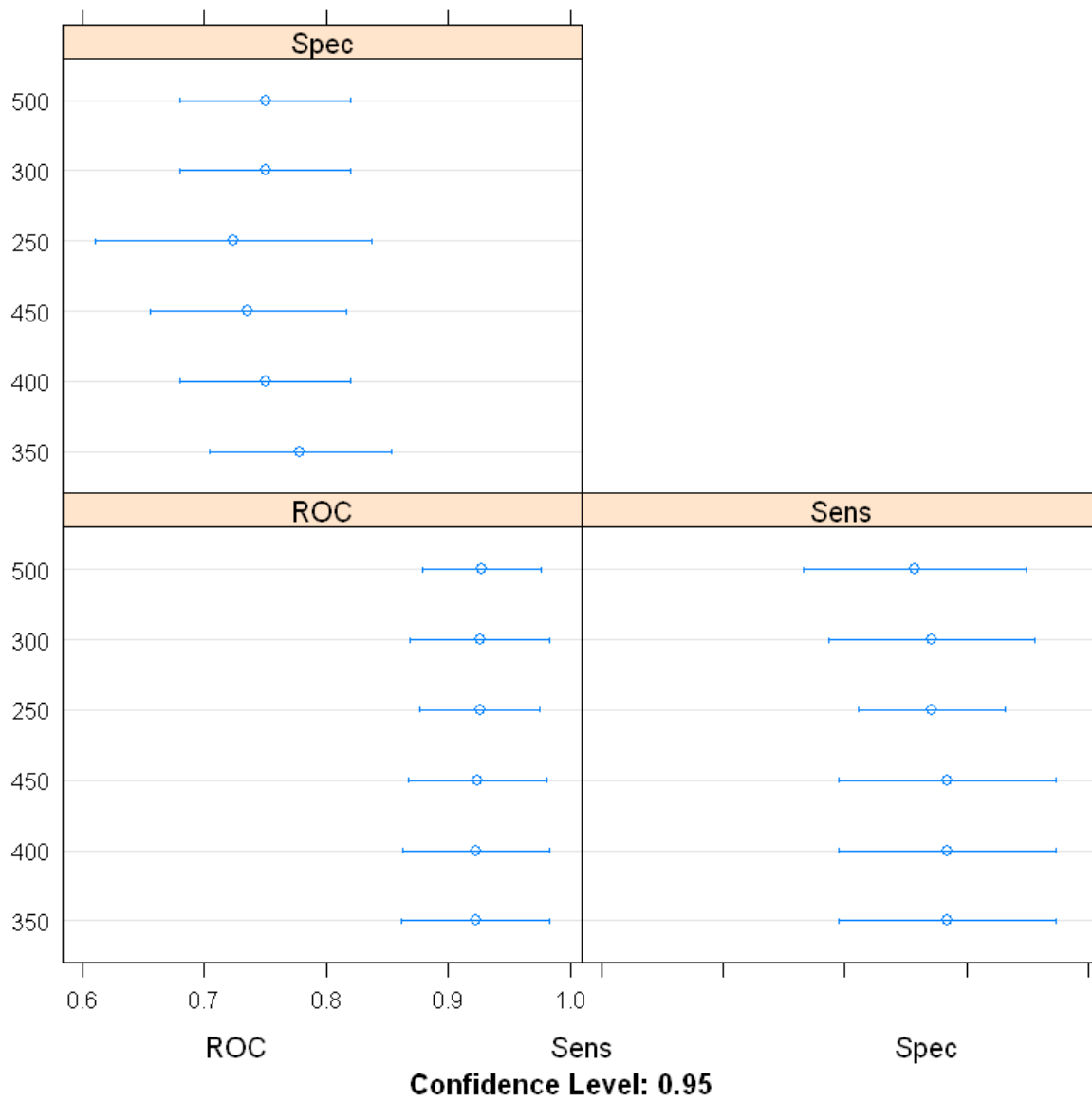


Figure 10: png

```
rf_list$`500`$results
```

A data.frame: 20 × 7

mtry

ROC

Sens

Spec

ROCSD

SensSD

SpecSD

<int>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

<dbl>

1

0.9346088

0.9250000

0.7071429

0.09101394

0.10540926

0.14892324

2

0.9149660

0.8982143

0.7523810

0.09055424

0.09926387

0.13801311

3

0.9232143

0.8857143

0.7214286

0.07220362

0.12463097

0.14110477

4

0.9119898

0.8571429

0.7642857

0.07617100

0.12821821

0.10191539

5

0.9244898

0.8714286

0.7523810

0.07212095

0.10233942

0.13801311

6

0.9136905

0.8464286

0.7380952

0.07677823

0.11424851

0.13327663

7

0.9250000

0.8303571

0.7500000

0.06360970

0.14217346

0.09736384

8

0.9214286

0.8571429

0.7357143

0.06751859

0.12821821

0.13110861

9
0.9102041
0.8446429
0.7666667
0.07345805
0.11846584
0.12387056
10
0.9201531
0.8446429
0.7214286
0.06638731
0.11846584
0.10411658
11
0.9229592
0.8446429
0.7500000
0.06562872
0.11846584
0.09736384
12
0.9066752
0.8446429
0.7214286
0.06961063
0.11846584
0.12399762
13
0.9131378
0.8446429
0.7357143
0.07488441
0.11846584
0.09010646
14

0.9097151
0.8446429
0.7357143
0.06800891
0.11846584
0.11249143
15
0.8980867
0.8446429
0.7214286
0.06515670
0.11846584
0.10411658
16
0.9061224
0.8446429
0.7500000
0.06337548
0.11846584
0.09736384
17
0.9016582
0.8428571
0.7666667
0.06593444
0.13979861
0.12387056
18
0.8903912
0.8446429
0.7500000
0.06514614
0.11846584
0.09736384
19
0.8980442

0.8446429

0.7500000

0.07201633

0.11846584

0.09736384

20

0.8978741

0.8303571

0.7500000

0.07291189

0.14217346

0.09736384

Grafico de los distintos valores de **mtry** para ntree=500

```
rf_list$`500` %>%  
  plot()
```

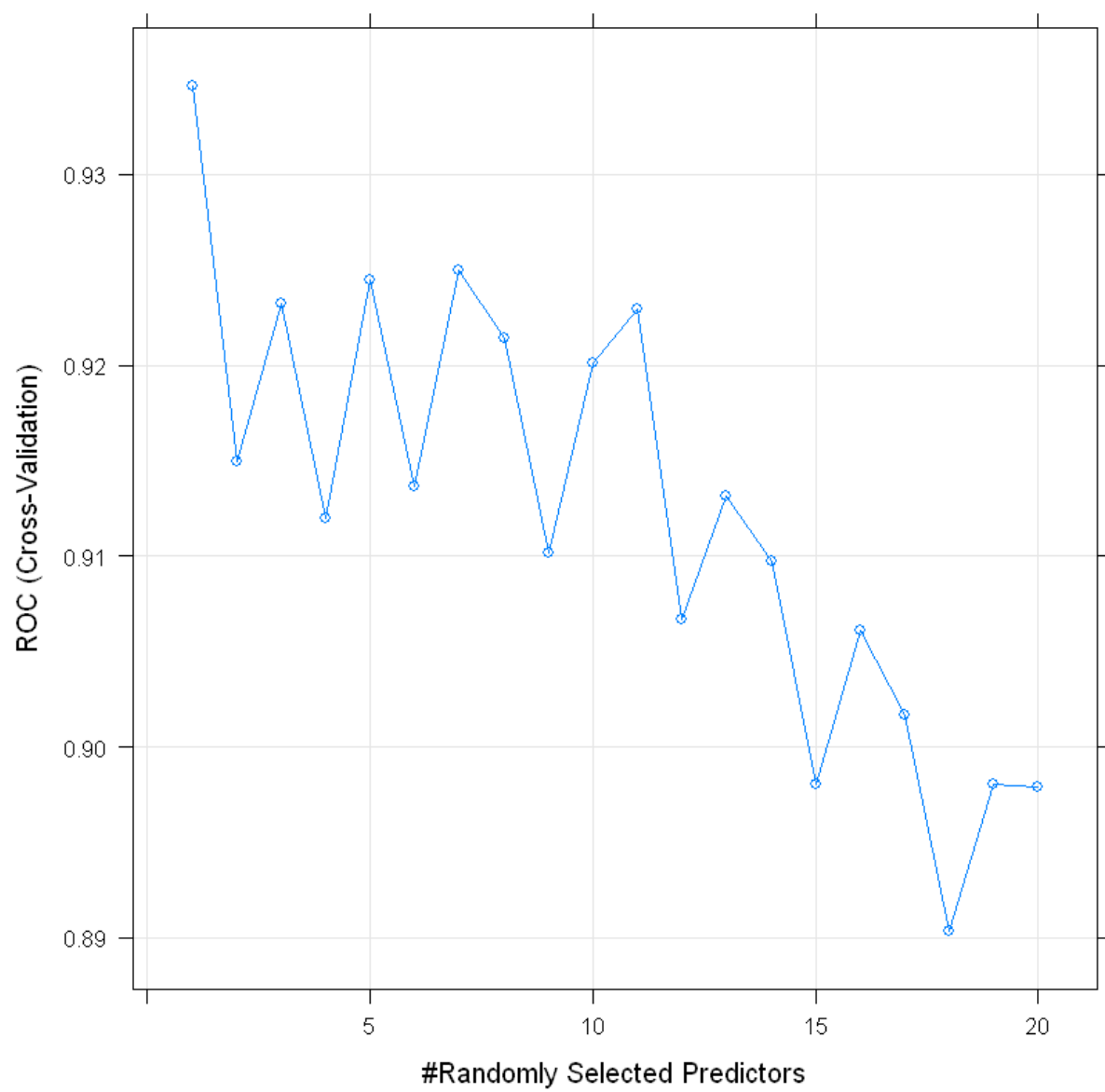


Figure 11: png