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#####
##第十回「k-近傍法」
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library(FNN)
library(kknn)

#####
## k-NN密度推定コード

#Z is query point matrix, X is data.
knn.density <- function(Z, X, k=10) {
  dd <- dim(X)
  n <- dd[1]
  d <- dd[2]
  tmp <- matrix(0, length(Z[, 1]), d)
  tmp <- knnx.dist(X, Z, k=k)
  res <- k/n/(pi^(d/2)/gamma(d/2+1)*tmp[, k]^d)
}

#####
## 世田谷区の中古マンション価格データ
## 価格 (price) と面積 (area) の分布を求める.
## 二次元データの密度関数

#データの読み込み
x <- read.csv("setagaya_mansion.csv", header=T)
ind = grep("1", x[[4]])
Y = 0*c(1:length(x[[1]]))
Y[ind] = 1
Y = factor(Y)
sman = data.frame(price=x[[1]], walk=x[[3]], area=x[[5]], str=ifelse(x[[6]]=="RC",
1, 0), kenpei=x[[7]], youseki=x[[8]], tikunen=x[[9]], kyuko=x[[10]]) #構造はダミー変

plot(sman$price, sman$area, xlab="price", ylab="area")

#訓練データの作成
train = matrix(0, length(Y), 2)
train[, 1] = sman$price/sd(sman$price) #データのスケールを揃える
train[, 2] = sman$area/sd(sman$area) #データのスケールを揃える
colnames(train) <- c("price", "area")
sman.sd = c(sd(sman$price), sd(sman$area))

#プロット用グリッドデータの作成
dif = max(train[, 1]) - min(train[, 1])
x1 = seq(min(train[, 1]) - dif*0.05, max(train[, 1]) + dif*0.05, len=100)
dif = max(train[, 2]) - min(train[, 2])
x2 = seq(min(train[, 2]) - dif*0.05, max(train[, 2]) + dif*0.05, len=100)
xgrid = expand.grid(x1, x2)
prob <- knn.density(xgrid, train, k=30)
prob_mat <- matrix(prob, length(x1), length(x2))

#ヒートマップのプロット
image(x = x1*sman.sd[1], y = x2*sman.sd[2], z = prob_mat, xlab = "price",
ylab = "area", main="k=30")
par(new=F)
points(train[, 1]*sman.sd[1], train[, 2]*sman.sd[2])
contour(x1*sman.sd[1], x2*sman.sd[2], prob_mat, add=TRUE)

#俯瞰図のプロット
persp(x = x1*sman.sd[1],
y = x2*sman.sd[2],
z = prob_mat,
xlab = "price",
ylab = "area",
zlab = "estimated density",
theta = 45, axes = TRUE, box = TRUE)

####判別#####
#部屋数1とそれ以外を判別

res = knn(train, xgrid, Y, k = 10, prob=TRUE)
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prob <- attr(res, "prob")
prob <- ifelse(res=="1", prob, 1-prob)

plot(train[,1]*sman.sd[1],train[,2]*sman.sd[2], col=ifelse(Y==1, "coral", "cornflowerblue"),main="", xlab="price", ylab="area")
contour(x = x1*sman.sd[1], y = x2*sman.sd[2], z = matrix(prob, length(x1), length(x2)), levels=0.5, add=TRUE)
points(x = xgrid[,1]*sman.sd[1], y = xgrid[,2]*sman.sd[2], pch=".", cex=1.2, col=ifelse(prob>0.5, "coral", "cornflowerblue"))
box()

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#####
# MNIST手書き文字認識
# k-NN判別

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data.train_origin <- read.csv("train_data.csv", header=FALSE) #訓練データの読み込み
data.test <- read.csv("test_data.csv", header=FALSE) #テストデータの読み込み

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train_size <- dim(data.train_origin)
dimx <- train_size[2] - 1
dimy <- train_size[2]
res = knn(data.train_origin[,1:dimx], data.test[,1:dimx], data.train_origin[,dimy], k = 10, prob=FALSE) #計算には数分かかる
clerr = mean(res!=data.test[,dimy]) # 0.0335, 96.65%の確率で正解.
table(res,data.test[,dimy])

```

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# 間違った例の表示
show_digit <- function(arr784, col=gray(12:1/12), ...) {
  x <- expand.grid(1:28, 1:28)
  image(matrix(arr784, nrow=28)[,28:1], col=col, ...)
}
misccls_ind <- sample(which((res!=data.test[,dimy])), 3)
show_digit(as.numeric(data.test[misccls_ind[1], 1:dimx]))
show_digit(as.numeric(data.test[misccls_ind[2], 1:dimx]))
show_digit(as.numeric(data.test[misccls_ind[3], 1:dimx]))

```

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#####
## k-NNの図
library(ElemStatLearn)
require(class)

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data(mixture.example)
x <- mixture.example$x
g <- mixture.example$y
xnew <- mixture.example$xnew
mod15 <- knn(x, xnew, g, k=15, prob=TRUE)
prob <- attr(mod15, "prob")
prob <- ifelse(mod15=="1", prob, 1-prob)
px1 <- mixture.example$px1
px2 <- mixture.example$px2
prob15 <- matrix(prob, length(px1), length(px2))

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par(mar=rep(2, 4))
contour(px1, px2, prob15, levels=0.5, labels="", xlab="", ylab="", main="15-nearest neighbour", axes=FALSE)
points(x, col=ifelse(g==1, "coral", "cornflowerblue"))
gd <- expand.grid(x=px1, y=px2)
points(gd, pch=".", cex=1.2, col=ifelse(prob15>0.5, "coral", "cornflowerblue"))
box()

```