

# STAT 427 Notes

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## Setup

```
# Loads the MNIST dataset, saves as an .RData file if not in WD
if (!(file.exists("mnist_data.RData"))) {

  ## installs older python version
  # reticulate::install_python("3.10:latest")
  # keras::install_keras(python_version = "3.10")
  ## re-loads keras
  # library(keras)

  ## get MNIST data
  mnist <- dataset_mnist()
  ## save to WD as .RData
  save(mnist, file = "mnist_data.RData")

} else {
  ## read-in MNIST data
  load(file = "mnist_data.RData")
}

# Access the training and testing sets
x_train <- mnist$train$x
y_train <- mnist$train$y
x_test <- mnist$test$x
y_test <- mnist$test$y

rm(mnist)
```

```
## plot function, from OG data
plot_mnist <- function(plt) {
  ## create image
  image(x = 1:28,
        y = 1:28,
        ## image is oriented incorrectly, this fixes it
        z = t(apply(plt, 2, rev)),
        ## 255:0 puts black on white canvas,
        ## changing to 0:255 puts white on black canvas
        col = gray((255:0)/255),
        axes = FALSE)

  ## create plot border
}
```

```

rect(xleft = 0.5,
     ybottom = 0.5,
     xright = 28 + 0.5,
     ytop = 28 + 0.5,
     border = "black",
     lwd = 1)
}

```

```
## train data
```

```
# initialize matrix
```

```
x_train_2 <- matrix(nrow = nrow(x_train),
                    ncol = 28*28)
```

```
## likely a faster way to do this in the future
```

```
for (i in 1:nrow(x_train)) {
  ## get each layer's matrix image, stretch to 28^2 x 1
  x_train_2[i, ] <- matrix(x_train[i, , ], 1, 28*28)
}
```

```
x_train_2 <- x_train_2 %>%
  as.data.frame()
```

```
## test data
```

```
x_test_2 <- matrix(nrow = nrow(x_test),
                   ncol = 28*28)
```

```
for (i in 1:nrow(x_test)) {
  x_test_2[i, ] <- matrix(x_test[i, , ], 1, 28*28)
}
```

```
x_test_2 <- x_test_2 %>%
  as.data.frame()
```

```
## re-scale data
```

```
x_train_2 <- x_train_2 / 256
x_test_2 <- x_test_2 / 256
```

```
## response
```

```
# x_test_2$y <- y_test
# x_train_2$y <- y_train
```

## Model

```
## for speed
```

```
n <- 10000
indices <- sample(x = 1:nrow(x_train_2),
                  size = n)
```

```
## init data
```

```

x_glm <- x_train_2[indices, ]
y_glm <- y_train[indices]
train_pred <- list()

## drop cols with all 0s
x_glm <- x_glm[, (colSums(x_glm) > 0)]

## 10 model method
for (i in 0:9) {
  print(i)

  y_glm_i = (y_glm == i)

  init_model <- cv.glmnet(x = x_glm %>% as.matrix,
                        y = y_glm_i,
                        family = binomial,
                        alpha = 1)

  train_pred[[i + 1]] <- predict(init_model,
                                x_glm %>% as.matrix,
                                s = init_model$lambda.min,
                                type = "response")
}

```

```

## [1] 0
## [1] 1

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```

```
## format results
predictions <- data.frame(train_pred)
names(predictions) <- c("zero",
                        "one",
                        "two",
                        "three",
                        "four",
                        "five",
                        "six",
                        "seven",
                        "eight",
                        "nine")

#write.csv(predictions, "pred.csv", row.names = FALSE)

## convert to numeric
max_col <- apply(X = predictions,
                 MARGIN = 1,
                 FUN = function(x) names(x)[which.max(x)])
```

```
word_to_number <- c("zero" = 0,
                    "one" = 1,
                    "two" = 2,
                    "three" = 3,
                    "four" = 4,
                    "five" = 5,
                    "six" = 6,
                    "seven" = 7,
                    "eight" = 8,
                    "nine" = 9)

preds <- word_to_number[max_col] %>% as.numeric

## confusion matrix
table(y_glm, preds)
```

```
##      preds
## y_glm  0    1    2    3    4    5    6    7    8    9
## 0  969    1    1    0    2    3    3    2    7    0
## 1    1 1083    6    6    1    2    0    1    7    0
## 2    5    8  891    9   11    2   12   11   20    3
## 3    1    5   18  931    3   24    4    8   16    8
## 4    1    3    2    1  920    1    4    1    9   29
## 5    7    5    2   22    7  822   15    1   15    6
## 6    0    5    7    1    3    8  951    0    2    0
## 7    1    5   10    0    9    2    0 1041    2   18
## 8    5   14    9   21    8   18    9    4  901   14
## 9    5    3    2    8   16    7    0   22    9  902
```

```
## misclassification rate
mean(!(y_glm == preds))
```

```
## [1] 0.0589
```