Machine learning Data Competition 2020 Report I.

Shreyasvi Natraj

1 Introduction

For the given data competition, we were provided with data pertaining to previous adverstisement campaigns as well as demographics of users who have been a part of the survey conducted.

For the objective of the given task, we are required to train a model that can be used in order to predict whether if a user is likely to have a "conversion" where a "conversion" refers to the user clicking on the advertisement and subscribing to the service.

Since the data provided is used in order to predict a categorical variable i.e. "conversion/y", we planned to use do a quick an dirty implementation of the following models to check for their accuracy:

K-Nearest Neighbours Random Forest LDA, QDA & C5.0 Supported Vector Machines *Logistic Regression

We initially carried out with exploratory data analysis for the data provided to us by considering na values as NaN values.

2 Exploratory data analysis

We observed from this that it would not be a good idea to not consider the na values as NaN but as a separate level. However, based on similarity in between the classes, we can merge different levels of a factor into lesser number of levels so they are easier for our model to interpret.

2.1 Interpretation

We also carried out the same process of data analysis after converting categorical variables into integer format which tend to show a similar fashion to the current analysis being carried out. However, we replaced "na" values with 0 which made the data much more consistent. We also observed that time_spent,outcome_old and X3 tends to hold a very high significance when predicting conversion y.

2.2 Plots

```
#install.packages("DataExplorer")
library(tidyverse)
library(DataExplorer)
dataset = read.csv('train.csv')
dataset[ dataset == "na" ] <- NA

web<- dataset
glimpse(web)</pre>
```

Rows: 8,526 ## Columns: 17

```
## $ age
                      <int> 35, 42, 38, 71, 37, 26, 27, 28, 57, 44, 34, 26, 33...
## $ job
                      <fct> manager, manager, industrial_worker, retired, unem...
                      <fct> single, married, married, married, single, married...
## $ marital
                      <fct> grad_school, grad_school, university, high_school,...
## $ education
## $ device
                      <fct> NA, smartphone, NA, smartphone, desktop, smartphon...
## $ day
                      <int> 30, 17, 14, 13, 27, 17, 30, 7, 26, 28, 12, 2, 6, 2...
## $ month
                      <int> 5, 7, 5, 11, 4, 7, 6, 5, 5, 12, 8, 12, 5, 5, 11, 2...
                      <dbl> 37.65, 39.25, 10.50, 8.80, 20.80, 57.00, 3.75, 10....
## $ time spent
## $ banner_views
                      <int> 1, 1, 2, 2, 2, 3, 5, 1, 5, 1, 1, 1, 1, 2, 1, 2, 1,...
## $ banner_views_old <int> 0, 0, 0, 1, 3, 0, 0, 1, 0, 0, 0, 0, 3, 0, 0, 0, 5,...
## $ days_elapsed_old <int> -1, -1, -1, 98, 179, -1, -1, 339, -1, -1, -1, -1, ...
## $ outcome_old
                      <fct> NA, NA, NA, success, other, NA, NA, other, NA, NA,...
## $ X1
                      <int> 0, 0, 0, 0, 0, 1, 0, 0, 0, 0, 0, 0, 1, 0, 0, ...
## $ X2
                      <int> 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 1, 0, 0, 0, ...
## $ X3
                      <int> 1, 1, 1, 0, 0, 1, 1, 1, 0, 0, 1, 0, 1, 1, 0, 0, 0,...
## $ X4
                      <dbl> 0.07793293, 0.07283969, 0.07607176, 0.09640840, 0....
## $ y
                      <int> 1, 1, 0, 1, 1, 1, 0, 0, 0, 1, 0, 1, 0, 0, 1, 0, 1, ...
#To go with glimpse(), DataExplorer itself has got a function called introduce()
introduce(web)
     rows columns discrete_columns continuous_columns all_missing_columns
## 1 8526
##
     total_missing_values complete_rows total_observations memory_usage
## 1
                     8911
                                   1917
                                                    144942
                                                                  655976
#The same introduce() could also be plotted in a pretty graph.
plot_intro(web, ggtheme = theme_dark(),
             title = "EDA with Data Explorer",
```



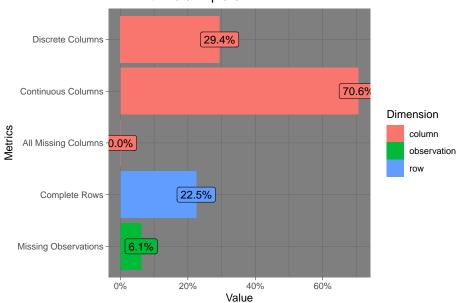


Figure 1: Data Distribution

Features missing from the whole observations

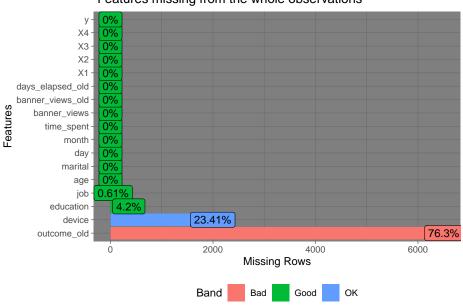


Figure 2: Missing Columns

###EDA for Continuous variables

```
##for univariate
DataExplorer::plot_histogram(web,
             ggtheme = theme_dark(),
             title = " Histogram of continuous features",
plot_density(web,
             ggtheme = theme_dark(),
             title = " Density of continuous features",
             ) # age, time_spent, X4 are right skewed
#outcome old hase a mode which is na-> remove this category? or remove this variable??
plot_bar(web,
             ggtheme = theme_dark(),
             title = " Density of continuous features",
             ) ##VISUALIZE DATA WHEN X2=0 AND =1 (subsetting)
                    a<- filter(web, web$X1==0)</pre>
                    b<- filter(web, web$X1==1)
                    plot_bar(a)
                    plot_bar(b)
                    plot_density(a,
```

```
title = " a")
                    plot density(b,
                                 title = " b")
##for bivariate
  plot_boxplot(web, by= 'day' , ncol = 1,
             ggtheme = theme_dark(),
             title = " Boxplot of continuous features by day",
###Correlation Plot
##autocorr plot
plot_correlation(web, cor_args = list( 'use' = 'complete.obs'),
             ggtheme = theme_dark(),
             title = " Autocorr Plot",
##continurous correlation plot
plot_correlation(web, type = 'c',cor_args = list( 'use' = 'complete.obs'),
             ggtheme = theme_dark(),
             title = " Continuous corr Plot",
             )
###EDA for Categorical'
plot_bar(a, maxcat = 390, parallel = FALSE,
             ggtheme = theme_dark(),
             title = " Categorical Features Plot",
             )
```

For more sophisticated graphs, that span over multiple pages, see function ggarrange() from ggpubr package (see link).

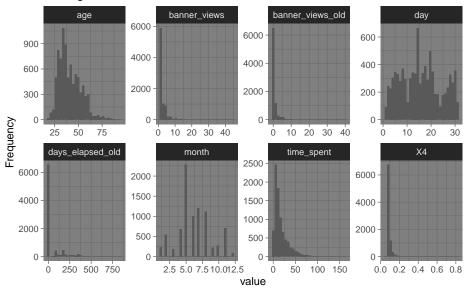
For good-looking colors, have a look at the Paul Tol's palette https://personal.sron.nl/~pault/.

2.3 Tables

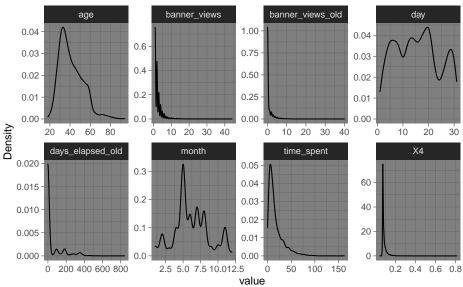
To display a table, look at the kable() function from knitr package. Also, consider the kableExtra package for more sophisticated options (see link). In Table 1, we show an example that uses both kable and kableExtra.

You can reference a table by putting the code \\label{tab:tblname} inside the caption. See code below. Then, you see that the reference works (see Table 1).

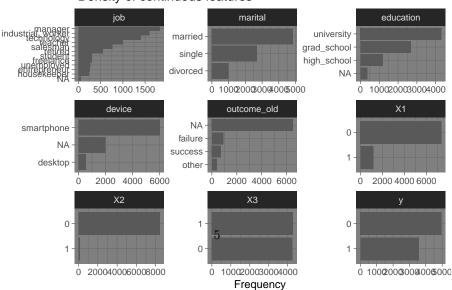
Histogram of continuous features



Density of continuous features



Density of continuous features



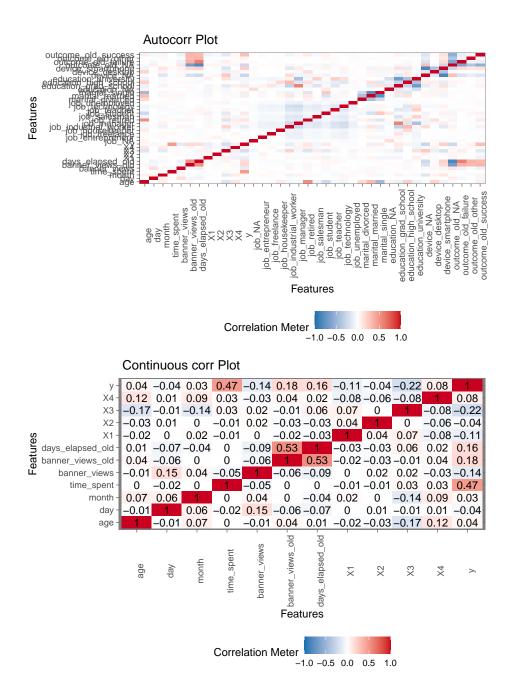


Figure 4: Correlation Plot

Categorical Features Plot education marital university married grad_school single high_school divorced 500 1000 1500 0 1000200030004000 1000 2000 3000 0 device outcome_old smartphone failure NA 0 success desktop 0 1002003004005000 2000 4000 6000 2000 4000 0 0 0 1000 2000 3000 0 1000200030004000 2000 4000 6000

Figure 5: Categorical Features Plot

Frequency

```
digits = 2,
   caption = capt) %>%
kable_styling(latex_options = c("striped", "hold_position"))
```

Table 1: Average and maximum miles per gallon for each number of cylindyers class.

cyl	Average	Max	Sqrt
4	26.66	33.9	56.62
6	19.74	21.4	31.08
8	15.10	19.2	54.21

If you want to manually insert the values in the table, you can do it, too (see Table 2).

Table 2: Number of different levels and the number of predictors that have this amount of levels.

	Col 1	Col 2	Col 3	Col 4
Number of different values	2	4	12	> 300
Number of predictors				

3 Models

3.1 Linear model

The first approach is to fit a linear model, that is, the regression function f in (??) is assumed to be of the form

$$f(X) = \beta_0 + \sum_{j=1}^{p} \beta_j X_j,$$

where $\beta_i \in \mathbb{R}$ is the coefficient of the jth predictor.

Fitting this model to the training data, we obtain a predictive model \hat{f}_{LM} . The training and cross-validation error of this model can be found in Table 3....

There are ... statistically significant predictors...

Possible meaning and interpretation of some predictors

4 Validation

We implement a cross-validation

5 Results

5.1 Preliminary Implementation

We started by dividing the set into 75-35 percent split and running them through different machine learning models in a crude manner to check out of the box which model tends to perform best on the given dataset.

```
#Support Vector Machine
rm(list=ls())
# Importing the dataset
dataset = read.csv('train.csv')
dataset$days_elapsed_old[dataset$days_elapsed_old<1] <- 0</pre>
dataset[ dataset == "na" ] <- NA</pre>
#Factor like columns
dataset$job=as.integer(as.factor(dataset$job))
dataset$marital=as.integer(as.factor(dataset$marital))
dataset$education=as.integer(as.factor(dataset$education))
dataset$device=as.integer(as.factor(dataset$device))
dataset$outcome_old=as.integer(as.factor(dataset$outcome_old))
dataset[is.na(dataset)] <- 0</pre>
# Encoding the target feature as factor
dataset$y= factor(dataset$y, levels = c(0, 1))
# Splitting the dataset into the Training set and Test set
#install.packages('caTools')
library(caTools)
set.seed(123)
split = sample.split(dataset$y, SplitRatio = 0.75)
training_set = subset(dataset, split == TRUE)
test_set = subset(dataset, split == FALSE)
# Feature Scaling
training_set[-17] = scale(training_set[-17])
test_set[-17] = scale(test_set[-17])
# Fitting SVM to the Training set
#install.packages('e1071')
```

```
library(e1071)
classifier = svm(formula = y ~ .,
                    data = training_set,
                    type = 'C-classification',
                    kernel = 'radial')
# Predicting the Test set results
y_pred = predict(classifier, newdata = test_set[-17],drop=TRUE)
y_pred
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```

```
## 8294 8297 8303 8305 8319 8320 8322 8325 8330 8335 8339 8340 8341 8349 8357 8358
     0
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## 8366 8371 8372 8373 8374 8386 8389 8396 8399 8412 8413 8425 8429 8434 8438 8440
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## 8504 8514 8521 8526
     1 0 1
## Levels: 0 1
# Making the Confusion Matrix
cm = table(test_set[, 17], y_pred)
##
     y_pred
##
        0
    0 1083 157
##
    1 168 724
print("========
                        library(ggplot2)
library(lattice)
library(caret)
confusionMatrix(cm)
## Confusion Matrix and Statistics
##
     y_pred
##
##
        0
             1
##
    0 1083 157
    1 168 724
##
##
##
                Accuracy : 0.8476
##
                  95% CI : (0.8316, 0.8626)
##
      No Information Rate: 0.5868
##
      P-Value [Acc > NIR] : <2e-16
##
##
                  Kappa: 0.6862
##
##
   Mcnemar's Test P-Value: 0.5791
##
##
             Sensitivity: 0.8657
##
             Specificity: 0.8218
##
          Pos Pred Value: 0.8734
##
          Neg Pred Value: 0.8117
##
              Prevalence: 0.5868
##
          Detection Rate: 0.5080
##
     Detection Prevalence: 0.5816
##
        Balanced Accuracy: 0.8438
##
##
         'Positive' Class : 0
##
```

```
rm(list=ls())
#Random Forest Classification
# Importing the dataset
dataset = read.csv('train.csv')
dataset$days_elapsed_old[dataset$days_elapsed_old<1] <- 0</pre>
dataset[ dataset == "na" ] <- NA</pre>
#Factor like columns
dataset$job=as.integer(as.factor(dataset$job))
dataset$marital=as.integer(as.factor(dataset$marital))
dataset$education=as.integer(as.factor(dataset$education))
dataset$device=as.integer(as.factor(dataset$device))
dataset$outcome_old=as.integer(as.factor(dataset$outcome_old))
dataset[is.na(dataset)] <- 0</pre>
# Encoding the target feature as factor
dataset\$y = factor(dataset\$y, levels = c(0, 1))
# Splitting the dataset into the Training set and Test set
# install.packages('caTools')
library(caTools)
set.seed(123)
split = sample.split(dataset$y, SplitRatio = 0.75)
training_set = subset(dataset, split == TRUE)
test_set = subset(dataset, split == FALSE)
# Feature Scaling #for higher resolution visualisation only we are using feature scaling,RF doesnt need
training_set[-17] = scale(training_set[-17])
test_set[-17] = scale(test_set[-17])
# Fitting Random Forest Classification to the Training set
#install.packages('randomForest')
library(randomForest)
classifier = randomForest(x = training_set[-17],
                           y = training_set$y)#,
                                                                              ntree = 700)
# Predicting the Test set results
y_pred = predict(classifier, newdata = test_set[-17])
y_pred
##
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                                                          31
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     56
##
                                    83
                                                   101
          59
               63
                     64
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                               69
                                          86
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##
    143
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              149
                   151
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##
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   183
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                         201
                              202
                                   205
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                                                        220
                                                              225
                                                                        229
                                                                              236
                                                                                   245
##
              194
                                         211
                                                                   226
##
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                                                              290
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##
    247
         252
              254
                   256
                         261
                              264
                                   267
                                         270
                                              274
                                                   279
                                                        283
                                                                   291
                                                                        293
                                                                              298
##
      0
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                1
    303 314 321 322 323 324 326 334
                                             339
                                                   341 346 349
                                                                   350 351
                                                                             353 365
```

```
0 1 1 1 1 1 0 1 0 1 0
           1
## 7278 7283 7289 7295 7298 7300 7311 7322 7325 7326 7327 7332 7337 7343 7344 7345
                0
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                                   1 0
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## 7347 7348 7351 7355 7357 7363 7366 7367 7368 7372 7374 7380 7383 7389 7391 7393
            0
                1
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## 7396 7402 7405 7409 7415 7418 7425 7428 7433 7435 7438 7439 7445 7448 7457 7458
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                0
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                        0
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## 7463 7465 7470 7471 7475 7476 7483 7484 7487 7489 7491 7493 7494 7495 7498 7504
           0
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                                           0 1
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        1
## 7508 7509 7521 7523 7524 7527 7538 7542 7546 7547 7553 7560 7570 7571 7578 7579
                1 0
                       1 0 1
                                    1 1
                                            0
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        1
## 7583 7584 7593 7597 7603 7606 7608 7609 7615 7618 7620 7628 7630 7631 7637 7638
                       0 1 0
                                   0 0
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        0
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## 7640 7642 7644 7649 7653 7663 7668 7669 7671 7672 7673 7677 7682 7684 7686 7687
                        0
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                                   0 0
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## 7691 7694 7698 7701 7702 7718 7721 7722 7724 7725 7738 7742 7744 7745 7747 7756
                0 0
                       0 0 0 1 0
                                           1 1 1
    1
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  7760 7767 7768 7771 7772 7774 7783 7785 7787 7788 7793 7798 7799 7801 7805 7808
                        1 0
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                1
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                                   1 1
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## 7813 7815 7821 7824 7829 7832 7839 7840 7845 7847 7850 7851 7865 7868 7874 7879
            0
                0
                    0
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## 7881 7882 7884 7886 7889 7890 7893 7902 7904 7908 7912 7918 7920 7921 7925 7930
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##
    1
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## 7931 7937 7938 7947 7948 7952 7960 7962 7970 7972 7973 7975 7978 7979 7980 7983
        0
           0
                1 1
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                                    0 0
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## 7985 7987 7988 7991 8000 8002 8015 8019 8021 8025 8033 8036 8045 8051 8052 8056
        1
            1
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                    0
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                           1 0 0 1
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                                                0 1
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## 8057 8059 8063 8067 8078 8079 8080 8083 8087 8091 8096 8099 8104 8108 8109 8112
        0
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                       0 0 0
                                   0 0
                                           0 0 0 0 1
## 8124 8136 8138 8140 8142 8144 8147 8149 8153 8154 8157 8160 8170 8176 8183 8206
    Ω
           0
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                  0
                       0 0 0 1 1
                                           1 1 0 1
## 8207 8209 8211 8216 8230 8241 8245 8249 8255 8265 8266 8267 8273 8284 8285 8289
                   0
                        0 0
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                                    0 0
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                0
## 8294 8297 8303 8305 8319 8320 8322 8325 8330 8335 8339 8340 8341 8349 8357 8358
                                            0 1
            0
                1
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                                                        0
## 8366 8371 8372 8373 8374 8386 8389 8396 8399 8412 8413 8425 8429 8434 8438 8440
                0
                        0
                            0
                                0
                                     0
                                        0
                                             0
## 8446 8451 8453 8454 8462 8464 8469 8472 8473 8479 8481 8487 8491 8494 8499 8501
                    0
                       0
                            0
                               0
                                   1
                                        0
      1
           0 1
                                             1
## 8504 8514 8521 8526
    1
        0 1
## Levels: 0 1
# Making the Confusion Matrix
cm = table(test_set[, 17], y_pred)
cm
    y_pred
##
##
        0
           1
##
    0 1092 148
    1 144 748
```

```
library(ggplot2)
library(lattice)
library(caret)
confusionMatrix(cm)
## Confusion Matrix and Statistics
##
##
      y_pred
##
          0
               1
##
     0 1092 148
     1 144 748
##
##
##
                  Accuracy: 0.863
##
                    95% CI: (0.8477, 0.8774)
##
       No Information Rate: 0.5797
##
       P-Value [Acc > NIR] : <2e-16
##
##
                     Kappa: 0.7188
##
   Mcnemar's Test P-Value: 0.8606
##
##
##
               Sensitivity: 0.8835
##
               Specificity: 0.8348
##
            Pos Pred Value: 0.8806
##
            Neg Pred Value: 0.8386
##
                Prevalence: 0.5797
##
            Detection Rate: 0.5122
##
      Detection Prevalence: 0.5816
##
         Balanced Accuracy: 0.8592
##
##
          'Positive' Class : 0
##
# Logistic Regression
rm(list=ls())
# Importing the dataset
dataset = read.csv('train.csv')
dataset$days_elapsed_old[dataset$days_elapsed_old<1] <- 0</pre>
dataset[ dataset == "na" ] <- NA</pre>
#Factor like columns
dataset$job=as.integer(as.factor(dataset$job))
dataset$marital=as.integer(as.factor(dataset$marital))
dataset$education=as.integer(as.factor(dataset$education))
dataset$device=as.integer(as.factor(dataset$device))
dataset$outcome_old=as.integer(as.factor(dataset$outcome_old))
dataset[is.na(dataset)] <- 0</pre>
# Encoding the target feature as factor
# Splitting the dataset into the Training set and Test set
# install.packages('caTools')
```

```
library(caTools)
set.seed(123)
split = sample.split(dataset$y, SplitRatio = 0.75)
training_set = subset(dataset, split == TRUE)
test_set = subset(dataset, split == FALSE)
# Feature Scaling
training set[,1:16] = scale(training set[,1:16])
test_set[-17] = scale(test_set[-17]) #removes third column alone
#fitting logistic regression to the training set
classifier = glm(formula = y ~ .,
                 family = binomial, #for logistic reg mention binomial
                 data = training_set)
#predicting the test set results
prob_pred = predict(classifier, type = 'response',newdata = test_set[-17]) #use type = response for logi
                                                                     #that will give the prob listed in t
prob_pred
              2
                            5
                                         6
## 0.8427212359 0.8821662255 0.9028108432 0.0186598106 0.2169430278 0.3187913640
             16
                           18
                                        20
                                                      21
                                                                   31
## 0.4782303985 0.0252262726 0.8918778421 0.0823708773 0.5398358529 0.9370782562
             37
                                        42
                                                      43
                                                                   56
                           41
  0.8913892844 0.4664663820 0.1313229621 0.9997663729 0.5743939009 0.3115089978
             63
                           64
                                        67
                                                      69
                                                                   83
## 0.7937269908 0.0859625570 0.4087884255 0.1425132971 0.0422665782 0.4473865664
             89
                          101
                                       110
                                                     115
                                                                  124
## 0.2757521457 0.9812313577 0.1740192571 0.0947024431 0.7163243271 0.4165784021
##
            128
                          140
                                       143
                                                     148
                                                                  149
  0.4296399412\ 0.0335868187\ 0.0319389717\ 0.1773857982\ 0.5745044887\ 0.3250740408
                                                     160
            154
                          155
                                       158
                                                                  163
  0.7786082651 0.3085817106 0.9695318767 0.0662565336 0.5687672687 0.4890073552
            165
                          167
                                       169
                                                     177
                                                                  179
  0.2853670543 0.4348449232 0.6442354423 0.0745776835 0.6486269487 0.1857915133
                                                     197
            183
                          187
                                       194
                                                                  201
## 0.0708530589 0.1128402316 0.0491328778 0.0802314221 0.1471116990 0.3279233390
            205
                          211
                                       217
                                                     218
                                                                  220
                                                                                225
  0.0334192875 0.8710546893 0.6143187140 0.9413090392 0.0947044261 0.3578358306
            226
                          229
                                       236
                                                     245
                                                                  247
## 0.0641709178 0.0363876683 0.0775469253 0.2908783168 0.0921471272 0.1170099652
            254
                          256
                                       261
                                                                  267
## 0.4497986798 0.2034595580 0.4151035300 0.0190968460 0.0240391340 0.9215563484
            274
                          279
                                       283
                                                     290
                                                                  291
## 0.0759669296 0.9394466496 0.0393926463 0.0361543395 0.3344552201 0.0648951230
                                       303
                                                                  321
            298
                          301
  0.1261714249 \ 0.1087129081 \ 0.9863396872 \ 0.9277931228 \ 0.8939585959 \ 0.4903711819
            323
                          324
                                       326
                                                     334
                                                                  339
  0.4928253065 \ 0.7112224833 \ 0.2807707676 \ 0.4819204009 \ 0.4355484823 \ 0.1071816304
            346
                          349
  0.2636266654 0.1807861423 0.0884365856 0.1168121487 0.0544154271 0.0674707529
                          367
                                       371
                                                     374
                                                                  383
  0.2522105678 0.0269585568 0.2242389735 0.1719779149 0.4713247761 0.3476375054
##
            389
                          397
                                       399
                                                     404
                                                                  405
                                                                                406
```

```
## 0.7266221212 0.0747423394 0.9435962397 0.2522363460 0.5452210213 0.9728591354
            407
                         413
                                      414
                                                    420
                                                                 421
## 0.0288847232 0.0305090071 0.7126591138 0.5318296010 0.9504087249 0.1978523459
                         439
                                      445
                                                    446
                                                                 449
## 0.9997068637 0.7108999840 0.0257316855 0.0250372955 0.9047651061 0.0199325408
            456
                         464
                                      468
                                                    474
                                                                 476
## 0.8836093246 0.5124794466 0.9560729935 0.9956181875 0.1860956286 0.5639502105
                                                    506
            485
                         499
                                      500
                                                                 509
## 0.5851835588 0.1785487766 0.6310813306 0.9229876968 0.9985369873 0.1843733740
            513
                         520
                                      524
                                                    528
                                                                 531
## 0.6237993704 0.3901467037 0.0561138441 0.0658393600 0.9938732259 0.2421568121
            535
                         537
                                      540
                                                    551
                                                                 552
## 0.1477377347 0.0487187701 0.7761498993 0.9558383406 0.1288449874 0.6868315254
            555
                         559
                                      560
                                                    570
                                                                 573
## 0.1430898977 0.3054583838 0.2362215718 0.0355941389 0.9909474463 0.9560547912
            587
                         589
                                       598
                                                    599
                                                                 603
## 0.1817102042 0.1554311241 0.7838649810 0.6184195435 0.4718718522 0.1898879173
                         607
                                      608
                                                    616
                                                                 622
## 0.1146138127 0.9925906279 0.5300779790 0.9907058228 0.7309126164 0.5722619669
                         634
                                      637
                                                    638
                                                                 649
## 0.1408050483 0.3626958523 0.5883584610 0.3926272572 0.1951526293 0.1938996218
            655
                         656
                                      657
                                                    662
## 0.0921989075 0.0292796161 0.3893592674 0.1298407846 0.7935512233 0.4043473978
            668
                         669
                                      673
                                                    674
                                                                 675
## 0.6969627490 0.9889617743 0.1029577406 0.4891231419 0.2064024618 0.8422276778
            682
                         683
                                      685
                                                    689
                                                                 692
## 0.8304146710 0.1806566008 0.9564386029 0.1178877679 0.4013439847 0.0607249397
            711
                         717
                                      719
                                                    721
                                                                 725
## 0.3550598446 0.0464215041 0.6235766711 0.9232803431 0.2141630071 0.7083231863
                         729
                                      731
                                                    734
                                                                 737
            727
## 0.2869430641 0.7155059260 0.3685152170 0.1806942522 0.1717116056 0.2229360731
            745
                         751
                                      756
                                                    762
                                                                 766
                                                                               768
## 0.6920740792 0.4424922894 0.5680989909 0.2619537970 0.0228702374 0.2458887409
                         775
            774
                                      778
                                                    780
                                                                 784
## 0.5016639889 0.7452189692 0.5410156219 0.7814342533 0.1609506864 0.0215661595
                         796
                                      797
                                                    802
            794
                                                                 803
## 0.4271086104 0.0222720713 0.7556824105 0.1915191897 0.0348983153 0.2146697029
                                                    822
            816
                         818
                                      821
                                                                 827
## 0.9589687551 0.5050111294 0.1112132641 0.0767809496 0.0365161363 0.0524727299
            832
                         838
                                      842
                                                    848
                                                                 849
## 0.8748462750 0.4699182576 0.8891908062 0.0812118239 0.0735926433 0.4656230432
            861
                         865
                                      870
                                                    876
                                                                 878
## 0.0557566068 0.7051716792 0.9318625904 0.1060984608 0.1314967294 0.2905341802
                                      888
                                                    892
            881
                         887
                                                                 893
## 0.2360140678 0.1477326107 0.5947489296 0.9764178255 0.1446939211 0.4160096997
            901
                         907
                                       913
                                                    915
                                                                 919
## 0.8641304264 0.0617085341 0.0659973686 0.3648946791 0.8629790976 0.0910740390
            923
                         925
                                      927
                                                    931
                                                                 936
## 0.1116908111 0.1253703961 0.2948226402 0.4092255974 0.7767598834 0.3765226691
                         953
                                      954
                                                    958
                                                                 959
            951
## 0.4914799935 0.1091224283 0.0103772116 0.8755572843 0.3555408609 0.9324593134
                         964
                                      967
                                                   971
                                                                 982
## 0.0361181183 0.7103004474 0.9999892499 0.1441943894 0.1160339250 0.3229467797
##
            999
                        1003
                                     1008
                                                   1013
                                                                1026
```

```
## 0.4253276635 0.7674064655 0.0088476985 0.8373842235 0.4253198204 0.1660452531
##
           1034
                        1042
                                     1047
                                                  1049
                                                                1050
                                                                             1056
## 0.4097443909 0.1647724817 0.0727836466 0.5366887926 0.6808192929 0.9222773902
                                     1070
                                                  1081
                        1069
                                                                1085
## 0.1244843092 0.0271962991 0.0960874278 0.0277840702 0.1325917066 0.3064933411
                                                               1129
           1093
                        1096
                                     1111
                                                  1119
## 0.9392259990 0.9110331073 0.7072247691 0.0642078220 0.9523021765 0.3692241392
           1133
                        1134
                                     1138
                                                  1140
                                                                1142
## 0.4726987178 0.3928184806 0.3995160613 0.6914438658 0.2972268619 0.2203297890
           1147
                        1148
                                     1153
                                                  1156
                                                                1162
## 0.2485347265 0.1984151885 0.2378029833 0.2901130859 0.9780776329 0.4702735926
           1170
                        1175
                                     1176
                                                  1182
                                                               1185
## 0.2894466912 0.2219644016 0.1234249490 0.1447607725 0.1270059839 0.4976027641
                       1202
                                     1213
                                                  1214
                                                                1225
## 0.3797609459 0.2684518375 0.7713773280 0.6661727088 0.2170191551 0.9549262628
                        1241
                                     1244
                                                  1249
                                                                1252
## 0.0426274297 0.4497419714 0.0914249967 0.1525578844 0.8166379190 0.8279353267
                        1266
                                     1269
                                                  1270
                                                                1278
## 0.1604035266 0.4203999228 0.3223071987 0.6230778123 0.2486835293 0.1432506747
           1287
                        1290
                                     1294
                                                  1303
                                                                1305
## 0.4368702189 0.9758617997 0.3779648809 0.2073209566 0.7266935901 0.6969286325
                        1319
                                     1329
                                                  1330
                                                               1335
## 0.9916972267 0.1592206642 0.6030155395 0.1804460379 0.3319056535 0.9202467975
           1339
                        1341
                                     1344
                                                  1347
                                                                1349
## 0.2286854102 0.8993638911 0.4250237499 0.2376842729 0.9539266428 0.1958100338
           1357
                        1364
                                     1367
                                                  1368
                                                                1373
## 0.2896726713 0.0735401322 0.8538813145 0.6491633640 0.1184148319 0.0268417395
           1375
                        1379
                                     1383
                                                  1385
                                                               1389
## 0.1781229313 0.6191771769 0.6563237414 0.3691258607 0.7112660397 0.5852901053
                        1406
                                     1407
                                                  1408
           1404
                                                                1410
## 0.0312643094 0.3496367143 0.2178910196 0.5945048427 0.0454531346 0.7925047080
           1419
                        1421
                                     1423
                                                  1427
                                                                1428
                                                                             1429
## 0.1076481738 0.7110853030 0.0639043123 0.8973427476 0.2843182283 0.9777055865
           1432
                        1436
                                     1443
                                                  1446
                                                                1451
                                                                             1453
## 0.2633429186 0.6591995649 0.2026881767 0.1628088389 0.8940015333 0.6836270582
                                     1466
           1457
                        1463
                                                  1473
                                                               1475
## 0.0933092172 0.0945007290 0.9994375248 0.0100189687 0.5725840576 0.9534935245
                                                  1481
                        1478
                                     1479
                                                                1483
## 0.0662934419 0.3187350804 0.1349942921 0.7604297498 0.9998424290 0.5132665654
                        1487
                                     1492
                                                  1496
                                                                1499
## 0.2143602871 0.0711317231 0.9980858769 0.0726554649 0.2446550204 0.9306798326
           1507
                        1508
                                     1512
                                                  1516
                                                                1520
## 0.4695217542 0.0236461989 0.5313207212 0.9952790696 0.9944905381 0.8991978325
           1527
                        1529
                                     1533
                                                  1546
                                                                1547
## 0.9749355245 0.0338309017 0.7134616472 0.1273410510 0.0978594805 0.6629413774
                                     1558
           1552
                        1553
                                                  1561
                                                                1565
## 0.1321637715 0.1649268081 0.0659345068 0.9961129412 0.4656292063 0.8686744873
                        1577
                                     1580
                                                  1581
                                                                1599
## 0.4439755099 0.3628248722 0.8225579230 0.7438543505 0.2542423470 0.0859160783
                        1623
                                     1634
                                                  1638
                                                               1640
           1621
## 0.5863233115 0.2290719033 0.9968294764 0.3487307984 0.0534887697 0.4055182734
                       1652
                                     1665
                                                  1673
                                                               1677
## 0.3992785358 0.0842061275 0.6315174766 0.2124532927 0.7514333976 0.1829086112
##
           1689
                        1694
                                     1718
                                                  1719
                                                                1723
```

```
## 0.1443069466 0.0394893114 0.9968683082 0.2222654940 0.1891133811 0.2879375404
           1729
                        1730
                                      1731
                                                   1735
                                                                1736
                                                                              1737
## 0.8942481348 0.3538740948 0.0443485808 0.6107358846 0.1386613420 0.5322744141
                                      1746
                        1743
                                                   1751
                                                                1752
## 0.4130585392 0.0612076379 0.5401391171 0.7133578530 0.0513424429 0.2088307685
                        1761
                                     1763
                                                   1767
                                                                1769
## 0.0943339904 0.9132528622 0.2293055812 0.7459048583 0.2475140695 0.2213419933
           1783
                        1792
                                      1796
                                                   1803
                                                                1806
## 0.1630408037 0.4768674687 0.4698006257 0.1038980833 0.9400645588 0.8207205037
           1808
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                                      1821
                                                   1823
                                                                1824
## 0.5087640920 0.5267291255 0.0724925045 0.4427365125 0.3800695806 0.0826483692
           1830
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                                      1839
                                                   1840
                                                                1843
## 0.2480974950 0.0419572027 0.5508859607 0.3225809292 0.2323319834 0.1484657975
           1849
                        1855
                                      1856
                                                   1858
                                                                1864
## 0.9174203904 0.2490171509 0.3840053654 0.4301348560 0.0677142983 0.2291179660
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                                      1876
                                                   1878
                                                                1882
## 0.3681074032 0.9123854963 0.8064131735 0.0304309181 0.8115530552 0.2711860728
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                                                   1925
                                                                1926
## 0.8930156631 0.8114115490 0.8817794229 0.1339574603 0.6003570547 0.6825702730
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                                                   1943
                                                                1956
## 0.6451832272 0.9503656656 0.6245100653 0.5224918914 0.5576304422 0.2280296923
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                                      1975
                                                   1976
                                                                1981
## 0.0358572495 0.5871142200 0.4211996623 0.0501034202 0.2754341083 0.4527744566
           1999
                        2003
                                      2004
                                                   2007
                                                                2008
## 0.0401270557 0.4685530412 0.0194887838 0.5071606176 0.0222849321 0.0727350251
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                                      2020
                                                   2027
                                                                2028
## 0.1926296044 0.0863218798 0.6082979470 0.2434299947 0.9627867061 0.1136993008
           2035
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                                                                2050
## 0.8086635572 0.0154586337 0.6276217442 0.1412160369 0.0979448521 0.0272088834
           2053
                        2056
                                      2073
                                                   2074
                                                                2076
## 0.1479069796 0.2650065141 0.0822077558 0.0709180660 0.9100098313 0.4298276841
           2083
                        2084
                                      2088
                                                   2093
                                                                2098
                                                                              2102
## 0.9019560533 0.0242904176 0.2427731595 0.1396748569 0.0289359568 0.1520883438
           2107
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                                      2115
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                                                                2120
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## 0.8285441382 0.5602458251 0.0422436341 0.2995303126 0.0934076216 0.0776665766
           2135
                        2139
                                     2140
                                                   2145
                                                                2150
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## 0.8966785017 0.2914481999 0.9851601230 0.8528181831 0.2266910292 0.0272487060
                                                   2167
           2154
                        2155
                                      2162
                                                                2168
## 0.4489733428 0.7601137160 0.0687093613 0.7508212237 0.0506460273 0.8957225793
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                                                   2199
                                                                2203
## 0.6952050234 0.1806210718 0.2485281308 0.3381455444 0.2662131669 0.4777250853
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                        2218
                                                   2226
                                                                2230
## 0.5395849862 0.2546567994 0.1286297806 0.4938980711 0.7966397403 0.0641362168
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                                                   2254
                        2247
                                                                2255
## 0.6081628295 0.2743655682 0.7125205463 0.8052577672 0.0950199640 0.3102040875
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                                                   2272
           2259
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## 0.7561643976 0.6038453448 0.2608721981 0.8243596385 0.1876170201 0.0502255464
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                                                   2289
                                                                2309
## 0.2927905966 0.0584992730 0.3293507268 0.1067857007 0.8675376222 0.0615541029
                        2322
                                      2327
                                                   2329
                                                                2330
                                                                              2332
## 0.9053783584 0.5192514381 0.0775227491 0.3392253329 0.3115180999 0.0957362523
                        2345
                                      2349
                                                   2353
                                                                2356
## 0.3516060132 0.9879875884 0.0273683210 0.0822066435 0.8389277296 0.3099140395
##
           2365
                        2373
                                      2376
                                                   2377
                                                                2385
                                                                              2389
```

```
## 0.2224820690 0.0028610951 0.3369252831 0.0917237933 0.9819106388 0.2099796521
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                                      2394
##
           2391
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                                                                 2403
                                                                              2406
## 0.8439687008 0.5553824519 0.0937385325 0.0708382102 0.0940618298 0.2408779424
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                                                   2426
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## 0.6911267050 0.0988565615 0.5400341764 0.0518749851 0.4292523328 0.4754673027
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                                                                 2457
## 0.8413828114 0.8508754431 0.3200916623 0.0516918664 0.9194538571 0.7791254208
                                                                 2469
           2462
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                                      2465
                                                   2466
## 0.2123976274 0.2525073137 0.1513729360 0.1854977668 0.1859640130 0.0134912665
           2475
                        2479
                                      2486
                                                   2488
                                                                 2491
                                                                              2504
## 0.4181681446 0.9577123014 0.9959496987 0.1217473607 0.4522092756 0.1234472670
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                                      2514
                                                   2515
                                                                 2516
                                                                              2520
## 0.1769548853 0.7550666412 0.2230115425 0.9784893996 0.1556974514 0.2169290156
           2521
                        2523
                                      2526
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                                                                 2534
## 0.5860864120 0.0731200742 0.0236594116 0.1500207504 0.8727439548 0.9502002077
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                                      2541
                                                   2542
                                                                 2546
## 0.0735093660 0.5753222426 0.0537980214 0.3285734914 0.1984301975 0.1470841758
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                                      2579
                                                   2580
                                                                 2581
## 0.7318241949 0.9486717821 0.9504032611 0.3392017115 0.0244135958 0.2295738655
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                                      2594
                                                   2595
                                                                 2598
                                                                              2601
## 0.4236747566 0.3827888793 0.9212544573 0.9881492377 0.4269532214 0.2590609454
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                                                                 2627
## 0.0716685989 0.2525619143 0.3992998690 0.0085681920 0.0312573333 0.1107583299
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                                                   2644
                                                                 2645
## 0.8562248544 0.0228084708 0.0871187328 0.2728003155 0.9393093219 0.0582564607
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                                      2657
                                                   2658
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  0.6856478355 0.2969946438 0.9886735129 0.1262449353 0.3296186132 0.0746366892
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## 0.4905002419 0.1852335816 0.0662754215 0.9096799402 0.2067487864 0.1897091436
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## 0.1085576624 0.2528134131 0.4093569565 0.8618764992 0.8409078349 0.5463065118
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                                                   2744
                                                                 2746
  0.4197600909 0.3744528275 0.2435908490 0.6592382662 0.8906925080 0.9837748701
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## 0.0328041521 0.3357268798 0.1575353229 0.9993650028 0.2963876886 0.0740177496
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                                                   2770
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## 0.2076164351 0.8406993826 0.0554582986 0.0919165658 0.0425595064 0.6657924411
                                                   2793
                                                                 2798
                        2785
                                      2787
## 0.1187566629 0.5884104387 0.0530951677 0.0948859038 0.8953870671 0.5505200104
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  0.6785942643 0.0401199205 0.3798595000 0.1182444526 0.0569809456 0.0232915532
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  0.0685381114 0.4882129302 0.1310920672 0.4897079098 0.0664784593 0.7266160145
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  0.0807471388 0.0399530629 0.1603880617 0.2348782158 0.8555957539 0.8307386546
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                                      2899
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## 0.4959174261 0.4789854385 0.8348903245 0.2516198999 0.2562131258 0.8934900633
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                                      2916
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                                                                 2927
  0.2143640274 0.8686909723 0.5354828604 0.4183308875 0.9271098187 0.7310658442
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  0.0138530254 0.7183457748 0.9587591670 0.3883120194 0.0514534096 0.5728270599
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                                      2962
                                                   2963
                                                                 2965
## 0.3302364489 0.3071722666 0.9197506505 0.3551373043 0.1733677362 0.3346978440
##
           2981
                         2984
                                      2985
                                                   2989
                                                                 3004
```

```
## 0.5893412667 0.1394203416 0.1753264450 0.4744124471 0.6311608735 0.0908300876
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                                                                 3044
##
           3017
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                                                                              3050
## 0.7623452343 0.9313438968 0.8457610970 0.0535285187 0.8335025441 0.2272082406
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                                      3061
                                                   3064
                                                                 3067
## 0.1981258950 0.0557004971 0.2788578199 0.0774541850 0.1431671221 0.5990807697
                                      3075
           3071
                        3074
                                                   3076
                                                                 3082
## 0.5416465378 0.2494667539 0.1160683618 0.2392721122 0.9602626701 0.0612276868
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                                      3098
                                                   3101
                                                                 3102
## 0.1727674829 0.0219640226 0.3351571968 0.3213291192 0.8679527541 0.3401627658
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                                      3119
                                                   3127
                                                                 3134
                                                                              3136
  0.5639532595 0.2240443390 0.9926235035 0.2897832696 0.4689467574 0.2537888393
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                                      3151
                                                   3160
                                                                 3172
                                                                              3173
## 0.9426323927 0.3731398426 0.6994971159 0.3333262218 0.8482817460 0.0413185870
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                                      3185
                                                   3186
                                                                 3189
## 0.0623718474 0.7769473994 0.3361783893 0.1077812142 0.0461094719 0.0235834118
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                                      3204
                                                   3206
                                                                 3210
  0.0961695384 0.5577562773 0.9879483370 0.2106631918 0.0119392229 0.4049746425
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                                      3231
                                                   3233
                                                                 3238
## 0.3014503211 0.0945538469 0.1788508616 0.2909468692 0.7767541440 0.9079793509
           3243
                        3245
                                      3246
                                                   3249
                                                                 3254
## 0.0636548451 0.0481725984 0.1020985465 0.2060419259 0.0781750946 0.1506296300
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                                      3272
                                                   3282
## 0.9941212502 0.1523289468 0.3668281833 0.2153783366 0.5523311242 0.3457874938
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                        3305
                                      3310
                                                   3323
                                                                 3325
## 0.9250561286 0.3191675595 0.1995700605 0.1847409032 0.0415710905 0.1275260573
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                                      3339
                                                   3341
                                                                 3344
  0.4353054681 0.5448268066 0.6067314503 0.0561520124 0.1288310395 0.1183128057
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                                      3356
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## 0.8419189361 0.1129435667 0.0937504951 0.8801542729 0.2708397972 0.0778580599
                        3374
                                      3384
                                                   3387
                                                                 3395
           3364
## 0.9114077437 0.6731301265 0.4034856566 0.0840248946 0.0525002735 0.0912802142
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                                      3408
                                                   3409
                                                                 3416
                                                                              3417
  0.1260280362 0.6560899420 0.3330102721 0.2710499925 0.2249028230 0.9997676671
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                                                                              3434
## 0.2100437483 0.6260818847 0.0224688527 0.2814230395 0.2375014894 0.1436717495
           3435
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                                      3441
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                                                                 3461
                                                                              3462
## 0.1332316352 0.7122450506 0.8264234762 0.2848711974 0.6064780128 0.8579630297
                                                   3477
           3464
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                                      3467
                                                                 3478
## 0.9764807292 0.8546973008 0.8883855654 0.7354695581 0.4173856592 0.9755385857
           3490
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                                      3499
                                                   3503
                                                                 3506
                                                                              3510
## 0.2007675159 0.0900084534 0.0787535593 0.9699169854 0.4604403677 0.0498505265
           3514
                        3523
                                      3524
                                                   3533
                                                                 3534
## 0.0401349163 0.2484859628 0.1702881374 0.9564778650 0.1732860368 0.8152836064
                                      3545
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  0.0928077225 0.1054540146 0.8467342428 0.1822929661 0.9289419777 0.9449086954
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                                      3563
                                                   3579
                                                                 3580
                                                                              3583
## 0.9530347406 0.3996338726 0.0578139013 0.5408528684 0.8661936732 0.4714776534
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                                      3590
                                                   3591
                                                                 3592
  0.7774036045 0.9425662432 0.7057402240 0.3227021639 0.6439194077 0.9031712273
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                                      3602
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  0.1809413054\ 0.0156853484\ 0.6000962204\ 0.9635602512\ 0.9233613173\ 0.8112507070
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                                      3621
                                                   3624
                                                                 3626
## 0.9299077190 0.3368887782 0.0987129184 0.2046181633 0.2396969175 0.8055905685
##
           3631
                        3641
                                      3646
                                                   3647
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                                                                              3654
```

```
## 0.0598637532 0.0359034612 0.0942105627 0.0306617740 0.1625046267 0.4641136741
##
           3659
                        3660
                                     3664
                                                   3676
                                                                3689
## 0.8568937067 0.8121691560 0.1062234711 0.3971145891 0.8840727644 0.0420800474
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                                                   3707
                                                                3711
## 0.8912217465 0.4270515317 0.5848266544 0.8447032929 0.8143755338 0.3317972706
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                                     3726
                        3724
                                                   3727
                                                                3741
## 0.5545959967 0.1069680011 0.9632694444 0.9601447642 0.4714199207 0.0525880494
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                                     3756
                                                   3758
                                                                3761
## 0.0597226188 0.9724439668 0.3011939325 0.0469393822 0.2242203479 0.2878899793
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                                                   3779
                                                                3781
## 0.8453655906 0.4361682628 0.7747031230 0.5352676126 0.9954185032 0.7019850442
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                                     3801
                                                   3808
                                                                3819
## 0.0490998083 0.9056396441 0.4318038313 0.0220423738 0.0350551774 0.1150542879
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                                                                3841
## 0.6968603749 0.0946175663 0.0364749031 0.9646896379 0.2444582977 0.9050725699
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                                     3872
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                                                                3878
## 0.2565790497 0.4168521304 0.8338718922 0.8824782089 0.9262008790 0.4444298622
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                                     3893
                                                   3895
                                                                3896
           3882
## 0.8527917356 0.1337330351 0.4570376068 0.1486961878 0.6614409292 0.0589390356
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                                     3906
                                                   3914
                                                                3917
## 0.1463800721 0.7531700293 0.0662393534 0.0303803573 0.1917074021 0.7375651519
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## 0.1217837024 0.6075292391 0.9630803599 0.2392723781 0.1158625361 0.0280472580
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                                     3958
                                                   3960
                                                                3962
## 0.8853412896 0.3544323381 0.3522116355 0.3613667539 0.0018757364 0.8375796807
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                                     3969
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## 0.4871592082 0.1142163430 0.3174821881 0.3494369608 0.7365097147 0.9010331184
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                        3981
                                     3982
                                                   3993
                                                                3996
## 0.2492172174 0.4857407348 0.0342498551 0.1462963401 0.2350821213 0.0149845348
                        4004
                                     4006
                                                   4007
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                                                                4015
## 0.9500916039 0.0541247325 0.9512567014 0.3563767821 0.3803485130 0.1129220120
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                                     4033
                                                   4034
                                                                4047
## 0.8183367456 0.4350403044 0.3824755514 0.1392874069 0.1341095471 0.1405059551
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                                                   4066
                                                                4069
## 0.2341726994 0.0414591257 0.2041658491 0.0267700933 0.2673546834 0.1731993548
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           4076
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                                                                4088
## 0.1390372218 0.1012559347 0.5856361423 0.3636563509 0.1309853199 0.5702965507
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                                     4097
                                                   4100
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## 0.4292284790 0.0321404067 0.1316028998 0.3155386504 0.3233328261 0.0845977365
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                        4112
                                     4113
                                                   4122
                                                                4127
## 0.8901201459 0.6497612511 0.3500260650 0.0450194133 0.9828685386 0.4670257089
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                        4135
                                     4136
                                                   4138
                                                                4139
## 0.4298620912 0.3856463463 0.8413777842 0.2794919091 0.4124368260 0.1012918358
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                        4151
                                     4152
                                                   4157
                                                                4158
## 0.3277566865 0.1213190493 0.1087050764 0.1777857165 0.1778009421 0.0783687445
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                                     4169
                                                   4171
                                                                4175
## 0.4961566627 0.2092655522 0.9369991583 0.4357908888 0.9853278773 0.5635174516
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                                     4190
                                                   4191
                                                                4197
## 0.0420461089 0.1235911568 0.1494940634 0.8342896677 0.0843536946 0.1289334776
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                                     4209
                                                   4210
                                                                4212
## 0.0496792137 0.3443435574 0.4961030476 0.1336745932 0.3995040216 0.0380265385
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                                     4219
                                                   4225
                                                                4236
## 0.1825957205 0.9376252971 0.9477572037 0.9999988732 0.9538037599 0.9691496631
##
           4241
                        4243
                                     4245
                                                   4247
                                                                4248
```

```
## 0.8893724250 0.2954437341 0.9995124705 0.5102670033 0.1792658701 0.2409873504
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##
           4256
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                                                                4271
                                                                              4280
## 0.0745432720 0.7911113361 0.4378311746 0.0284453578 0.8422923281 0.6969160803
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                                      4287
                                                   4290
                                                                4291
           4282
## 0.5213929527 0.2717748863 0.0994264630 0.9987522094 0.1944170081 0.5890457113
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                                                   4333
                                                                4334
## 0.3741532225 0.3015874805 0.0606849925 0.2088872423 0.0288378170 0.1851658904
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                                                                4364
## 0.2722593476 0.3049130176 0.6651766066 0.2196373221 0.0177696033 0.9999856334
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## 0.0122132245 0.9694009242 0.1555391763 0.0406503762 0.9993492521 0.1015759512
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                                                                4403
## 0.6813052661 0.1290921899 0.4023566802 0.1733170522 0.2165043815 0.2947766029
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## 0.9392025826 0.6053043161 0.3417191846 0.1706744621 0.9771299277 0.8440421210
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## 0.7824580397 0.1633938603 0.3665062151 0.1560267550 0.0451435184 0.1182113415
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## 0.0717282971 0.1953724172 0.7063857485 0.9066637858 0.4724090414 0.0713963731
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## 0.9091448464 0.0525093524 0.3159181805 0.2860336081 0.1641413962 0.3198218788
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## 0.9381447196 0.0292182592 0.0523313449 0.0662240143 0.3030051284 0.4086732964
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## 0.4783155496 0.0409915903 0.0667369320 0.1416218515 0.8742573280 0.3107851229
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## 0.9974063951 0.3703691030 0.8883882481 0.1346067632 0.1663101658 0.0915806856
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                                                   4548
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## 0.7502477235 0.6038673221 0.7730068392 0.3199207891 0.1215470781 0.5558587330
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## 0.5967526913 0.7936461397 0.9719128228 0.3626259653 0.7854207311 0.0226809740
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## 0.6837848935 0.8432161794 0.8334425651 0.0781396834 0.9389816748 0.9978070368
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## 0.0731227022 0.7794622587 0.1982648156 0.5841394929 0.3101475343 0.2266164383
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## 0.9555105123 0.6248732064 0.5823512200 0.5365492341 0.1711789640 0.4544200583
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## 0.2010082792 0.6102897037 0.4387844948 0.1654514149 0.1258391674 0.2126878797
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## 0.9670247192 0.0800784538 0.2338408794 0.0775180306 0.6217834422 0.9309769420
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## 0.2439174512 0.6157479418 0.4371762049 0.2608287623 0.2326006305 0.8241018340
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## 0.6906224342 0.1588326569 0.9807735606 0.6392213550 0.0492253736 0.4611767291
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## 0.6129428209 0.5896720145 0.1615290378 0.3915460629 0.1057443593 0.1777446848
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## 0.9998396900 0.2778292200 0.3070768803 0.3707977483 0.3193128137 0.0815017980
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## 0.0922103244 0.2143290319 0.7784782882 0.0939202462 0.3139402549 0.0454963259
##
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                                      4937
                                                   4938
                                                                4939
```

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## 0.0079395011 0.6370939859 0.2777620649 0.4875618415 0.1548195176 0.9761417394
##
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## 0.2881037836 0.1181279051 0.2493424390 0.4046349872 0.2299220646 0.8178780062
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## 0.2068794048 0.3317845888 0.4001730597 0.7117677264 0.2364541752 0.8774038752
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## 0.1650018029 0.0594425474 0.6330110200 0.1593990270 0.2351575274 0.1563392808
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                                                   5014
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## 0.1631741883 0.0380200113 0.9379977603 0.2011142950 0.8880658200 0.2370719719
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## 0.7712436559 0.9525018009 0.0346193754 0.8476492540 0.8558507469 0.7916716967
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## 0.1417330125 0.2291436262 0.2071424180 0.3775700726 0.6983452744 0.8845606935
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## 0.8104054335 0.8180858344 0.4882710023 0.0414775075 0.7855138996 0.5293915853
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## 0.0826812427 0.6434956578 0.5440350304 0.7886679922 0.0735338809 0.4635222148
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## 0.8863427272 0.3770581114 0.3315216769 0.0867182807 0.9160718469 0.0392503521
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## 0.2023397402 0.6010466752 0.2111862552 0.1160546640 0.0935222897 0.7369836053
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## 0.9740774601 0.0505456983 0.0200509757 0.0599115749 0.9643174083 0.1017848448
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## 0.9533737443 0.8935543970 0.3281964847 0.7662934387 0.4234872433 0.1350378206
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## 0.2229800996 0.4917021812 0.2413669324 0.1031592507 0.6759426107 0.6234937448
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## 0.9414893412 0.1456513789 0.3427045608 0.1152147524 0.2875529536 0.3051923815
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## 0.2293930924 0.0229380202 0.6314888885 0.8843923611 0.0073008171 0.1064044041
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## 0.0191091203 0.2772269222 0.8017274842 0.0493279297 0.5678595741 0.9913397491
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## 0.1637793820 0.1068500649 0.7412021799 0.1719271453 0.1720576154 0.1361237639
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## 0.1316850328 0.5673187511 0.3438157488 0.4361321401 0.9909400834 0.4316636446
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## 0.7513054520 0.1440631952 0.9550271172 0.1996878920 0.8286866329 0.1455543626
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## 0.2440419508 0.0692652698 0.5576201809 0.7484172947 0.0662251971 0.5275204794
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## 0.8705595394 0.9653546518 0.1641657905 0.2016589056 0.9481644019 0.0601856002
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  0.1853057139\ 0.8901305720\ 0.5004726125\ 0.1290207360\ 0.8726360499\ 0.5202757953
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## 0.0498392339 0.0308041601 0.9484663259 0.6402121183 0.7875999894 0.2195308723
##
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```

```
## 0.0596494962 0.0983445653 0.1591324578 0.6620892682 0.3986204033 0.0090319210
##
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## 0.3657876167 0.1603072196 0.9959962344 0.3824281895 0.8470823746 0.9095675936
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## 0.3035668499 0.2246701658 0.3167686787 0.9160510623 0.0788755518 0.4842219228
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## 0.8595467139 0.0941071135 0.2619326892 0.2380027262 0.0426382511 0.0976039446
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## 0.9841528897 0.1124614101 0.8328841375 0.5122996502 0.0970374135 0.9819160700
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  0.1096591979 0.4929192813 0.0252030760 0.7699172349 0.1563505357 0.9810987540
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## 0.4585605105 0.5664395408 0.1986277213 0.1318253491 0.2849459147 0.5038176318
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## 0.9060147756 0.3026174369 0.6916912063 0.1560227384 0.6536874818 0.0272457001
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## 0.0989942450 0.3914544908 0.9309691954 0.1586885608 0.5309921505 0.1846826242
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## 0.2578355382 0.9732447830 0.1537003261 0.2918518995 0.8959532306 0.4264892039
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## 0.1378817860 0.1228178948 0.6639213244 0.6305886094 0.9593788201 0.0428873220
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## 0.2993424229 0.5239602136 0.1734658432 0.9300815772 0.2424716299 0.2792958835
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## 0.4569576088 0.1430461595 0.4020832685 0.8539205327 0.0402830364 0.1915323077
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## 0.1604089008 0.0338109359 0.0326276827 0.0017919050 0.9512286728 0.0722594846
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                                                                5937
## 0.2136774227 0.8856957162 0.9332830988 0.1201137182 0.6626551788 0.3606996585
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## 0.9915768093 0.5409876487 0.9772078022 0.4832150471 0.0244964110 0.0511865982
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## 0.1680903349 0.8924745402 0.9731706225 0.5891310126 0.1324158674 0.6636704305
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## 0.5322730939 0.2920653840 0.2378149814 0.0381094670 0.6695388059 0.7982738384
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## 0.5580779224 0.0621572149 0.3319712645 0.9326326524 0.4453703588 0.0038999565
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## 0.7911144149 0.5107677762 0.0171563365 0.2218190615 0.4969995118 0.3730819017
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## 0.3378421979 0.1676492517 0.0519055809 0.3475178125 0.4993513265 0.5610380060
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                                                   6103
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## 0.2020955609 0.5360540001 0.8381384776 0.5978917880 0.8321811425 0.5334258518
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## 0.0776338466 0.1115972219 0.1659276751 0.2201545231 0.0185363324 0.8936276194
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## 0.8947526646 0.2000381556 0.0449770094 0.4899273713 0.0497853716 0.1791584686
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  0.9618058653 0.3549463340 0.1689864571 0.7171206696 0.3822016750 0.9747337265
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## 0.5117456149 0.5345687581 0.2805568139 0.6357565949 0.6154613986 0.9059392007
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## 0.1975068649 0.9597540987 0.8407475901 0.1206905493 0.5681185945 0.2715846224
##
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```

```
## 0.2656286487 0.1715638734 0.6210097672 0.0206886534 0.2713821656 0.0315542813
##
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## 0.0850517128 0.2569796651 0.1268491103 0.0417794271 0.8843360209 0.2104757556
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  0.4248007505 0.4429775364 0.1307723055 0.0958076620 0.3469932174 0.2944125834
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## 0.9614601451 0.1042474296 0.9645641673 0.7623110548 0.2040538364 0.3070560153
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## 0.2225916747 0.2392021840 0.0033041793 0.1498003868 0.4330713602 0.1264324690
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  0.5860313756 0.2760761287 0.1361387624 0.3115374577 0.0508197580 0.6363852972
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  0.4551267958 0.9708876382 0.4221543476 0.2508128883 0.1840297345 0.4967950799
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  0.9390255872 0.2469377378 0.6463982496 0.4377681670 0.3370168231 0.5179222936
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## 0.0273777069 0.1001022998 0.0204723756 0.5691295353 0.0500110292 0.6059019547
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## 0.9432541608 0.2881662452 0.9079357698 0.0229290844 0.9177695999 0.2039581787
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## 0.0490907065 0.0246059729 0.9983559968 0.0912424927 0.0265131983 0.1204492218
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## 0.3270515323 0.1396073656 0.0474876002 0.1939831518 0.6780246347 0.1790118827
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  0.5173334940 0.6429027788 0.0708476650 0.9324213454 0.5946933828 0.0822442796
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## 0.4766924316 0.6050499419 0.9677271937 0.0748165543 0.5895881206 0.3938677447
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## 0.3222477819 0.9501677747 0.2035495722 0.9264531584 0.2895063933 0.4661301330
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  0.2824156580\ 0.8362934989\ 0.8615650168\ 0.1172630087\ 0.4068899470\ 0.6065829045
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  0.0821475307 0.3351175201 0.4067171621 0.0508315050 0.3138171245 0.1626492031
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## 0.1508890623 0.1761548909 0.3134423932 0.8031785966 0.4640561162 0.0980603991
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## 0.0825642143 0.8227168676 0.5939480955 0.5123273551 0.1687204679 0.6969819270
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  0.6670526336 0.3716476585 0.7361070328 0.6636851035 0.0710496947 0.1003426265
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  0.9595189831 0.8723037830 0.6300202336 0.0078000850 0.2970316902 0.7050377265
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  0.9888168305 0.2736542739 0.9877644076 0.4896425017 0.9389490055 0.1562002255
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## 0.3172600729 0.0408282631 0.6099494678 0.8208625751 0.0572388170 0.0469243319
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  0.0380327749 0.8804977662 0.1031505485 0.3354008434 0.2456969363 0.2540935272
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## 0.9487519657 0.1332157296 0.0488258895 0.5785278880 0.9589263561 0.0210270238
##
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                                                  6859
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```

```
## 0.2538128427 0.0331246680 0.1551765829 0.0220730344 0.7793939296 0.0282473760
##
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## 0.7496984225 0.9061561056 0.4444788976 0.0285568599 0.3926877320 0.9578586860
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## 0.4827418702 0.4563419942 0.9496729034 0.2762986818 0.1529105968 0.3482972484
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## 0.0455206511 0.2689672941 0.3439518771 0.4171572020 0.0602906824 0.6100458944
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## 0.2718034761 0.1955415828 0.1053211143 0.2001991133 0.0401679076 0.0806522942
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## 0.2345674649 0.8772176257 0.3888451538 0.4743550929 0.1471233025 0.3146291306
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## 0.0181511339 0.3583186914 0.6454518834 0.2602659241 0.9826379471 0.3161787773
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## 0.2757405495 0.0006488195 0.4130511215 0.5324344267 0.2539583922 0.9894953045
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## 0.4176124354 0.1743528454 0.3463012718 0.0683841403 0.4933701363 0.9700878794
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## 0.5328560793 0.0282403528 0.6041963066 0.8739758692 0.3452842674 0.0662225348
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## 0.1303507373 0.1705661866 0.6416392054 0.1627737666 0.9017530777 0.0519841815
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## 0.2818476219 0.5939577047 0.0292057501 0.2617446472 0.5755498632 0.0605195640
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## 0.9893921661 0.0707037524 0.0276416881 0.0106452920 0.7469952659 0.1405979854
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## 0.1426199013 0.2121144578 0.7304083883 0.9891814556 0.4592619060 0.0219609608
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## 0.3687419188 0.5315868393 0.8449246971 0.8465078567 0.1125391138 0.1041187081
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                                                   7273
                                                                 7274
  0.4393763170 0.1248833675 0.7041436878 0.2161027400 0.0182300999 0.2253392140
                                      7289
                                                   7295
           7278
                        7283
                                                                 7298
                                                                              7300
## 0.9158116415 0.1953998257 0.1467724007 0.3061117763 0.9058356851 0.0479137423
                                     7325
                                                   7326
           7311
                        7322
                                                                7327
                                                                              7332
## 0.0924853319 0.8513873863 0.6629117540 0.3134090408 0.3119370607 0.4523286347
                                     7344
                                                   7345
                                                                7347
                        7343
## 0.4678011762 0.8138901632 0.0298942361 0.6052681547 0.0418168566 0.0487252660
           7351
                        7355
                                      7357
                                                   7363
                                                                 7366
## 0.1106228809 0.9343116083 0.6331113410 0.4599261419 0.4628384129 0.1345859813
                                      7374
           7368
                        7372
                                                   7380
                                                                7383
                                                                              7389
## 0.2294276931 0.1280525256 0.9765657938 0.6658840603 0.4735053719 0.0242880834
                        7393
                                      7396
                                                   7402
           7391
                                                                 7405
  0.0998005500 0.3237764933 0.8965277859 0.0387801821 0.9998441945 0.4258805747
                                                   7428
           7415
                        7418
                                      7425
                                                                 7433
## 0.9149237997 0.3952719411 0.0002403137 0.1031685121 0.9898557583 0.0547637960
           7438
                        7439
                                      7445
                                                   7448
                                                                 7457
  0.4354302851 \ 0.4015187434 \ 0.9987105964 \ 0.6685971290 \ 0.1184313153 \ 0.2388010404
           7463
                        7465
                                      7470
                                                   7471
                                                                 7475
                                                                              7476
  0.0968075738 0.6861141918 0.2162114591 0.8330426445 0.2288547026 0.2702654580
                        7484
                                      7487
                                                   7489
                                                                 7491
## 0.3235253563 0.2828863881 0.9452929750 0.4970123188 0.0558496021 0.8286141286
##
           7494
                        7495
                                      7498
                                                   7504
                                                                 7508
```

```
## 0.0451569889 0.2587167266 0.2323183369 0.8976062905 0.0222077239 0.7503541504
                                                   7527
           7521
                        7523
                                     7524
                                                                7538
## 0.5377292780 0.8469362104 0.0674959616 0.8682350593 0.0519403742 0.3225453111
                                     7553
                                                   7560
                                                                7570
                        7547
## 0.8999694613 0.6776658114 0.4870976572 0.0337628137 0.1720970684 0.1254086689
           7578
                        7579
                                     7583
                                                   7584
                                                                7593
## 0.0636413832 0.5113028981 0.0631477279 0.0843888512 0.5739508256 0.8576748617
           7603
                        7606
                                      7608
                                                   7609
                                                                7615
## 0.4099403820 0.6045363422 0.7508515493 0.2637270884 0.1192846811 0.2602935096
           7620
                        7628
                                     7630
                                                   7631
                                                                7637
  0.3565266034 0.9932838249 0.0775581287 0.1668019845 0.2058025371 0.1287848176
           7640
                        7642
                                      7644
                                                   7649
                                                                7653
                                                                              7663
## 0.4187711651 0.5553609135 0.9981640822 0.9267866861 0.2064546939 0.2456954756
           7668
                                                   7672
                        7669
                                      7671
                                                                7673
## 0.0883314180 0.3742330307 0.0149279334 0.3957114550 0.6979448057 0.2987606225
           7682
                        7684
                                      7686
                                                   7687
                                                                7691
## 0.7456277072 0.4989326852 0.0008342736 0.6614426637 0.5133048029 0.0638651801
           7698
                        7701
                                      7702
                                                   7718
                                                                7721
## 0.4094875229 0.0657965908 0.0590783622 0.1084583093 0.1495082916 0.4763462175
                        7725
                                     7738
                                                   7742
                                                                7744
## 0.8978702810 0.2682594897 0.8688226642 0.4563831206 0.5151443783 0.9236938116
                                     7760
                        7756
                                                   7767
                                                                7768
## 0.8424981042 0.5074891877 0.1827605236 0.8869207598 0.0400784824 0.9964577127
           7772
                        7774
                                      7783
                                                   7785
                                                                7787
## 0.6335399744 0.4690560497 0.0910954635 0.4311157120 0.3577044239 0.6300555274
                        7798
                                     7799
                                                   7801
                                                                7805
## 0.3043459047 0.1415326779 0.2151965181 0.9960122414 0.5227561525 0.4611415132
           7813
                        7815
                                     7821
                                                   7824
                                                                7829
## 0.7222843383 0.3920625751 0.0888341249 0.1338069273 0.1413685419 0.3744242882
           7839
                        7840
                                      7845
                                                   7847
                                                                7850
## 0.5421373372 0.8706999455 0.3165516219 0.1307840157 0.6383328054 0.0601839524
           7865
                        7868
                                      7874
                                                   7879
                                                                7881
  0.3853557182 0.2973873778 0.8699408616 0.1874448779 0.8077431044 0.0196950666
                                      7889
                                                   7890
           7884
                        7886
                                                                7893
## 0.1603857389 0.0639259751 0.9973125263 0.2894629597 0.1139301658 0.9807547831
                        7908
                                     7912
           7904
                                                   7918
                                                                7920
## 0.8716877476 0.1719655162 0.9956960456 0.1443797407 0.1275611158 0.0988324645
                        7930
                                     7931
                                                   7937
                                                                7938
           7925
## 0.8977462360 0.0536120114 0.1779234437 0.0070797753 0.1655613212 0.9411788322
           7948
                        7952
                                      7960
                                                   7962
                                                                7970
  0.6248251078 0.0152342986 0.9924921036 0.4359332985 0.0229615611 0.2733962104
                                     7978
           7973
                        7975
                                                   7979
                                                                7980
## 0.9835287690 0.3907914587 0.0686369665 0.4530486333 0.9908278586 0.9898470761
                        7987
                                     7988
                                                                8000
           7985
                                                   7991
  0.0464152181 0.9193874110 0.8620981454 0.9977932331 0.1100622464 0.9915733909
                                                   8025
           8015
                        8019
                                      8021
                                                                8033
## 0.9878421703 0.2700104305 0.1343124572 0.6153289732 0.6945166781 0.2177702256
           8045
                        8051
                                      8052
                                                   8056
                                                                8057
  0.7088399932 0.9988378599 0.2001589371 0.3485668957 0.9061435809 0.4990304442
           8063
                        8067
                                      8078
                                                   8079
                                                                8080
  0.8013775106\ 0.4269293624\ 0.8659621366\ 0.1064679197\ 0.0903844865\ 0.1072217465
                        8091
                                     8096
                                                   8099
                                                                8104
## 0.0955849775 0.0623618265 0.1413721925 0.1024613990 0.1139896321 0.3008028491
##
           8109
                        8112
                                      8124
                                                   8136
                                                                8138
```

```
## 0.9971768410 0.0629836559 0.1672086410 0.0422126014 0.3695951458 0.9438498950
##
           8142
                          8144
                                        8147
                                                      8149
                                                                    8153
                                                                                  8154
  0.0338398491 0.1023026847 0.4908054877 0.1791693125 0.3574532760 0.9308677143
           8157
                          8160
                                        8170
                                                      8176
                                                                    8183
                                                                                  8206
##
   0.9876275644 0.4116433363 0.2186167063 0.8168667266 0.9931355052 0.3483357037
           8207
                          8209
                                                      8216
                                                                    8230
##
                                        8211
                                                                                  8241
   0.4279646482 0.3264669900 0.0851804847 0.2721992022 0.3469934901 0.0690838069
                          8249
##
           8245
                                        8255
                                                      8265
                                                                    8266
## 0.1369898711 0.2762762765 0.1515746773 0.0001645700 0.1251792783 0.9458550007
##
           8273
                          8284
                                        8285
                                                      8289
                                                                    8294
                                                                                  8297
   0.9594486889 0.4806863704 0.7816911580 0.3610272184 0.2071575643 0.0285060588
##
           8303
                          8305
                                        8319
                                                      8320
                                                                    8322
                                                                                  8325
##
  0.0679959682 0.6294381900 0.9420492102 0.4661849021 0.9099086629 0.0390349603
##
           8330
                          8335
                                        8339
                                                      8340
                                                                    8341
                                                                                  8349
  0.6503877532 0.5615915068 0.0740465081 0.6844706395 0.7804705436 0.1737888669
##
           8357
                          8358
                                        8366
                                                      8371
                                                                    8372
  0.7203391739\ 0.0643430160\ 0.2075303929\ 0.0363743900\ 0.3296286250\ 0.1601625074
           8374
                          8386
                                        8389
                                                      8396
                                                                    8399
  0.6786673083 0.0565757117 0.1994286309 0.0440869935 0.1948840740 0.2084650583
##
           8413
                          8425
                                        8429
                                                      8434
                                                                    8438
                                                                                  8440
  0.1497561978 \ \ 0.1381987496 \ \ 0.7798062316 \ \ 0.9925426483 \ \ 0.7790550780 \ \ 0.9303494516
##
                                        8453
                          8451
                                                                    8462
## 0.0412895406 0.6652936830 0.1301928336 0.9999434721 0.2246600373 0.5193171953
##
                          8472
                                        8473
                                                                    8481
## 0.2735949964 0.3979867737 0.4832977107 0.5170726567 0.4896236159 0.0811328246
                          8494
                                        8499
                                                      8501
                                                                    8504
##
  0.0389597954\ 0.5144790599\ 0.4742996031\ 0.0254169161\ 0.7551348045\ 0.0820815406
           8521
                          8526
## 0.6908998166 0.3197976914
y_pred = ifelse(prob_pred > 0.5, 1, 0)
y_pred
##
      2
            5
                 6
                      7
                                15
                                      16
                                           18
                                                 20
                                                      21
                                                           31
                                                                 36
                                                                      37
                                                                            41
                                                                                 42
                                                                                       43
                           11
                                 0
##
      1
            1
                 1
                      0
                            0
                                       0
                                            0
                                                       0
                                                             1
                                                                  1
                                                                       1
                                                                             0
                                                                                  0
                                                                                        1
                                                 1
     56
           59
                63
                           67
                                69
                                      83
                                           86
                                                 89
                                                     101
                                                                115
                                                                     124
                                                                                128
                                                                                      140
##
                     64
                                                          110
                                                                           125
                                 0
                                                                                  0
##
           0
                      0
                            0
                                       0
                                            0
                                                 0
                                                            0
                                                                  0
                                                                             0
                                                                                        0
      1
                 1
                                                       1
                                                                       1
```



```
## 7583 7584 7593 7597 7603 7606 7608 7609 7615 7618 7620 7628 7630 7631 7637 7638
                                1
                                   0
                                        0
                                             0
                                                  0
                                                      1
##
     0
         0
              1
                  1
                       0
                           1
                                                           0
                                                               0
                                                                    0
## 7640 7642 7644 7649 7653 7663 7668 7669 7671 7672 7673 7677 7682 7684 7686 7687
                       0
                           0
                                             0
                  1
                                0
                                    0
                                         0
                                                  1
                                                      0
## 7691 7694 7698 7701 7702 7718 7721 7722 7724 7725 7738 7742 7744 7745 7747 7756
##
              0
                  0
                       0
                           0
                                0
                                    0
                                              0
                                                      0
                                         1
                                                  1
                                                           1
                                                                1
## 7760 7767 7768 7771 7772 7774 7783 7785 7787 7788 7793 7798 7799 7801 7805 7808
         1
              0
                  1
                       1
                           0
                                0
                                    0
                                         0
                                              1
                                                  0
                                                      0
                                                           0
                                                                1
## 7813 7815 7821 7824 7829 7832 7839 7840 7845 7847 7850 7851 7865 7868 7874 7879
         0
              0
                  0
                       0
                           0
                                1
                                    1
                                         0
                                              0
                                                  1
                                                      0
                                                           0
                                                                0
## 7881 7882 7884 7886 7889 7890 7893 7902 7904 7908 7912 7918 7920 7921 7925 7930
                  0
                       1
                           0
                                0
                                    1
                                         1
                                              0
                                                  1
                                                      0
                                                           0
## 7931 7937 7938 7947 7948 7952 7960 7962 7970 7972 7973 7975 7978 7979 7980 7983
                  1
                       1
                           0
                               1
                                    0
                                         0
                                             0
                                                  1
                                                      0
                                                           0
## 7985 7987 7988 7991 8000 8002 8015 8019 8021 8025 8033 8036 8045 8051 8052 8056
                 1
                     0
                         1 1
                                  0
                                         0
                                             1
                                                1
                                                      0
                                                         1
         1
            1
                                                              1
## 8057 8059 8063 8067 8078 8079 8080 8083 8087 8091 8096 8099 8104 8108 8109 8112
                           0
                                0
                                    0
                                         0
                                             0
                                                  0
                  0
                     1
                                                      0
## 8124 8136 8138 8140 8142 8144 8147 8149 8153 8154 8157 8160 8170 8176 8183 8206
                  1
                       0
                           0
                                0
                                    0
                                         0
                                              1
                                                  1
                                                      0
                                                           0
## 8207 8209 8211 8216 8230 8241 8245 8249 8255 8265 8266 8267 8273 8284 8285 8289
                            0
                  0
                       0
                                0
                                    0
                                         0
                                              0
                                                  0
## 8294 8297 8303 8305 8319 8320 8322 8325 8330 8335 8339 8340 8341 8349 8357 8358
         0
              0
                  1
                       1
                           0
                                1
                                    0
                                         1
                                              1
                                                  0
                                                      1
                                                           1
                                                                0
## 8366 8371 8372 8373 8374 8386 8389 8396 8399 8412 8413 8425 8429 8434 8438 8440
                  0
                       1
                           0
                                0
                                    0
                                         0
                                              0
                                                  0
                                                      0
                                                           1
                                                                1
## 8446 8451 8453 8454 8462 8464 8469 8472 8473 8479 8481 8487 8491 8494 8499 8501
         1
             0
                  1
                       0
                           1
                                0
                                    0
                                         0
                                             1
                                                  0
                                                      0
## 8504 8514 8521 8526
##
     1
         0
              1
#making the confusion matrix
cm = table(test_set[,17], y_pred)
cm
##
     y pred
##
        0
             1
##
    0 1110 130
##
    1 257 635
library(ggplot2)
library(lattice)
library(caret)
confusionMatrix(cm)
## Confusion Matrix and Statistics
##
##
     y_pred
##
         0
             1
##
    0 1110 130
```

##

##

1 257 635

```
##
                 Accuracy : 0.8185
##
                   95% CI: (0.8015, 0.8346)
##
      No Information Rate: 0.6412
      P-Value [Acc > NIR] : < 2.2e-16
##
##
##
                    Kappa: 0.6194
##
##
   Mcnemar's Test P-Value: 1.504e-10
##
              Sensitivity: 0.8120
##
##
              Specificity: 0.8301
           Pos Pred Value: 0.8952
##
           Neg Pred Value: 0.7119
##
##
               Prevalence: 0.6412
##
           Detection Rate: 0.5206
##
     Detection Prevalence: 0.5816
##
        Balanced Accuracy: 0.8210
##
##
         'Positive' Class: 0
##
#-----
#Naive Bayes
rm(list=ls())
# Importing the dataset
dataset = read.csv('train.csv')
dataset$days_elapsed_old[dataset$days_elapsed_old<1] <- 0</pre>
dataset[ dataset == "na" ] <- NA</pre>
#Factor like columns
dataset$job=as.integer(as.factor(dataset$job))
dataset$marital=as.integer(as.factor(dataset$marital))
dataset$education=as.integer(as.factor(dataset$education))
dataset$device=as.integer(as.factor(dataset$device))
dataset$outcome_old=as.integer(as.factor(dataset$outcome_old))
dataset[is.na(dataset)] <- 0</pre>
# Encoding the target feature as factor
dataset$y = factor(dataset$y, levels = c(0, 1)) #labels /levels -both are same
# Splitting the dataset into the Training set and Test set
# install.packages('caTools')
library(caTools)
set.seed(123)
split = sample.split(dataset$y, SplitRatio = 0.75)
training_set = subset(dataset, split == TRUE)
test_set = subset(dataset, split == FALSE)
# Feature Scaling
training_set[-17] = scale(training_set[-17])
test_set[-17] = scale(test_set[-17])
# Fitting Naive Bayes to the Training set
```

```
library(e1071)
classifier = naiveBayes(x = training_set[-17],
                  y = training_set$y)
# Predicting the Test set results
y_pred = predict(classifier, newdata = test_set[-17])
# Making the Confusion Matrix
cm = table(test_set[, 17], y_pred)
library(ggplot2)
library(lattice)
library(caret)
confusionMatrix(cm)
## Confusion Matrix and Statistics
##
##
    y_pred
##
       0
           1
##
   0 1020 220
   1 325 567
##
##
##
             Accuracy : 0.7444
##
               95% CI: (0.7253, 0.7628)
##
     No Information Rate: 0.6309
##
     P-Value [Acc > NIR] : < 2.2e-16
##
##
                Kappa: 0.4659
##
  Mcnemar's Test P-Value: 8.394e-06
##
##
##
           Sensitivity: 0.7584
##
           Specificity: 0.7205
##
         Pos Pred Value: 0.8226
##
         Neg Pred Value: 0.6357
##
            Prevalence: 0.6309
##
         Detection Rate: 0.4784
##
    Detection Prevalence: 0.5816
##
       Balanced Accuracy: 0.7394
##
##
       'Positive' Class : 0
#-----
#Decision Tree Classification
rm(list=ls())
# Importing the dataset
dataset = read.csv('train.csv')
```

```
dataset$days_elapsed_old[dataset$days_elapsed_old<1] <- 0</pre>
dataset[ dataset == "na" ] <- NA</pre>
#Factor like columns
dataset$job=as.integer(as.factor(dataset$job))
dataset$marital=as.integer(as.factor(dataset$marital))
dataset$education=as.integer(as.factor(dataset$education))
dataset$device=as.integer(as.factor(dataset$device))
dataset$outcome_old=as.integer(as.factor(dataset$outcome_old))
dataset[is.na(dataset)] <- 0</pre>
# Encoding the target feature as factor
dataset\$y = factor(dataset\$y, levels = c(0, 1))
# Splitting the dataset into the Training set and Test set
# install.packages('caTools')
library(caTools)
set.seed(123)
split = sample.split(dataset$y, SplitRatio = 0.75)
training_set = subset(dataset, split == TRUE)
test_set = subset(dataset, split == FALSE)
# Feature Scaling #no need to scale, but to visualise in high resolution if we scale, the results will b
training_set[-17] = scale(training_set[-17])
test_set[-17] = scale(test_set[-17])
# Fitting Decision TreeClassification to the Training set
library(rpart)
classifier = rpart(formula = y ~ .,
                 data = training_set)
# Predicting the Test set results
y_pred = predict(classifier, newdata = test_set[-17], type = 'class')
# Making the Confusion Matrix
cm = table(test_set[, 17], y_pred)
library(ggplot2)
library(lattice)
library(caret)
confusionMatrix(cm)
## Confusion Matrix and Statistics
##
##
     y_pred
##
        0
             1
    0 1064 176
##
    1 262 630
##
##
##
                Accuracy : 0.7946
```

```
95% CI: (0.7768, 0.8115)
##
##
      No Information Rate: 0.622
      P-Value [Acc > NIR] : < 2.2e-16
##
##
##
                    Kappa: 0.5721
##
   Mcnemar's Test P-Value: 4.877e-05
##
##
##
              Sensitivity: 0.8024
##
              Specificity: 0.7816
##
           Pos Pred Value: 0.8581
           Neg Pred Value: 0.7063
##
               Prevalence: 0.6220
##
##
           Detection Rate: 0.4991
##
     Detection Prevalence: 0.5816
##
        Balanced Accuracy: 0.7920
##
##
         'Positive' Class: 0
#-----
# k-nearest neighbors (K-NN)
rm(list=ls())
# Importing the dataset
dataset = read.csv('train.csv')
dataset$days_elapsed_old[dataset$days_elapsed_old<1] <- 0</pre>
dataset[ dataset == "na" ] <- NA</pre>
#Factor like columns
dataset$job=as.integer(as.factor(dataset$job))
dataset$marital=as.integer(as.factor(dataset$marital))
dataset$education=as.integer(as.factor(dataset$education))
dataset$device=as.integer(as.factor(dataset$device))
dataset$outcome_old=as.integer(as.factor(dataset$outcome_old))
dataset[is.na(dataset)] <- 0</pre>
# Encoding the target feature as factor
# Encoding the target feature as factor #(the values are considered as numeric values i.e 1 > 0 but we
#Instead we want them to consider as factors i.e 1 and 0 as two different categories.)
dataset$y = factor(dataset$y, levels = c(0, 1))
# Splitting the dataset into the Training set and Test set
# install.packages('caTools')
library(caTools)
set.seed(123)
split = sample.split(dataset$y, SplitRatio = 0.75)
training_set = subset(dataset, split == TRUE)
test_set = subset(dataset, split == FALSE)
# Feature Scaling
training_set[-17] = scale(training_set[-17])
```

```
## [1666] 0 0 0 0 0 0 1 0 0 0 1 1 0 0 1 1 0 0 0 1 1 1 0 1 1 1 0 1 1 1 0 1 1 1 0 0 0 1 1
## [1962] 1 0 0 0 1 1 1 1 1 1 0 0 0 0 0 1 1 0 1 0 1 0 1 0 0 0 0 1 0 0 1 1 0 1 0 0
## [1999] 1 0 0 0 0 1 1 0 1 1 0 0 1 0 0 0 1 1 0 1 0 1 0 1 0 1 0 1 0 1 0 1 0 0 1 0 0 1 0 1
## [2036] 1 1 0 0 0 0 0 0 0 0 0 1 0 0 0 0 1 1 0 0 0 1 1 1 1 1 0 1 1 0 0 1 0 0 0 0 0
## [2073] 0 0 0 1 1 0 0 0 0 0 0 1 1 0 1 0 1 0 0 1 0 1 0 1 0 1 0 1 0 1 0 0 0 0 0 0 0 0
## [2110] 1 0 1 0 1 0 1 0 1 0 0 0 1 1 0 0 1 1 0 1 0
## Levels: 0 1
# Making the Confusion Matrix
cm = table(test_set[, 17], y_pred)
   y_pred
##
##
     0
        1
##
  0 1107 133
##
  1 282 610
print("-----")
## [1] "-----KNN-----KNN------
library(ggplot2)
library(lattice)
library(caret)
confusionMatrix(cm)
## Confusion Matrix and Statistics
##
##
   y_pred
##
     0
        1
  0 1107 133
##
  1 282 610
##
##
##
          Accuracy : 0.8053
##
           95% CI: (0.7879, 0.822)
##
    No Information Rate: 0.6515
    P-Value [Acc > NIR] : < 2.2e-16
##
##
##
            Kappa: 0.5904
##
##
  Mcnemar's Test P-Value: 3.729e-13
##
##
        Sensitivity: 0.7970
##
        Specificity: 0.8210
       Pos Pred Value: 0.8927
##
##
       Neg Pred Value: 0.6839
##
         Prevalence: 0.6515
##
       Detection Rate: 0.5192
```

	Training error	CV error	Public Leaderboard error (if available)
kNN	•••		
Ridge	•••		
lasso	•••		
ElasticNet			
random forest			·
SVM			
LDA	•••		
QDA			
C5.0			

Table 3: Training and CV error of the different models.

```
## Detection Prevalence : 0.5816
## Balanced Accuracy : 0.8090
##
## 'Positive' Class : 0
##
```

6 Some general comments

Here are some comments that apply to many of the intermediate reports.

- Write your team name on the front page.
- Write you own original report, do not follow step by step the exercise but rather think about a useful structure for your own report.
- Use plots and figures, but only those that contain relevant information.
- In R plots, make sure that there are labels on each axis, that they are readable, that there is a caption that says what the plot or figure shows, the size of the points/lines is appropriate, the form of the plot is as you want it (e.g., squared), etc.
- Use tables, again be careful to describe what the table shows in a caption.
- Avoid lengthy R output of model fits.
- Explain what you do: if you use a model, give a brief description in terms of a formula. You don't have to reproduce what we did in lecture, but the report should be readable on its own and be consistently written and structured.
- In the same vein as the previous comment, if you use notation like AIC, explain what this is and why
 you use it.
- The response is not required to be normal in a linear model (or any other method), it is only assumed to be normal conditional on the predictor values, that is, the residuals should be normal. Slight violation of this does not mean that the model is useless for prediction. Test its performance with CV.
- Careful with excluding predictors, even if there is high corrlation, there might be additional information.
 Test with CV.
- It is always good to know the difficulty of the problem. One can assess this by starting with simple benchmark models like the overall mean, kNN, LM, etc. In the report you should try these models and report their errors, this gives you also a feeling about what type of model performs well on this data. You don't have to report the errors 20 different LMs with interactions, just choose the relevant models (e.g., the best LM with interactions).

- If you use CV (and you should), describe what you do exactly. Make sure to use the same CV for all models to make them comparable.
- $\bullet\,$ Try to use Latex or RMarkdown, it looks better!

7 Some tests

Hello test