kNN, Exploration and Prediction of Health Indicators in Relation to Diabetes: A Practical Approach

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Exploration and Prediction of Health Indicators in Relation to Diabetes: A Practical Approach

Introduction

In this exercise, we will embark on a predictive analysis concerning health indicators and diabetes by employing the k-Nearest Neighbors (KNN) algorithm. Our primary objective is to elucidate the connection between various health indicators and the presence of diabetes. We will embark on a comprehensive exploration of the dataset, prepare the data for machine learning, and proceed to train a KNN model for predictive purposes. Below, we will guide you through the code, dissecting it step by step.

Part 1: Exploration and Data Manipulation

```
library(tidyverse)
library(caret)
library(MASS)
library(glmnet)
library(boot)
```

- **install.packages(c("caret", "MASS", "glmnet", "boot"))** installs the specified R packages if they are not already installed. These packages are essential for various data analysis tasks.

- **library(tidyverse)** loads the tidyverse package, which is a collection of R packages designed for data manipulation and visualization. It includes packages like ggplot2 and dplyr.

- **library(caret), library(MASS), library(glmnet), and library(boot)** load the respective packages into the R environment. These packages are used for machine learning, statistical modeling, and bootstrapping techniques.

```
data <- read.csv("diabetes_012_health_indicators_BRFSS2015 (2).csv")
```

Reading the Dataset: read.csv("diabetes_012_health_indicators_BRFSS2015 (2).csv") reads the CSV (Comma-Separated Values) file named "diabetes_012_health_indicators_BRFSS2015.csv" into an R dataframe named data. This dataset likely contains health-related indicators, possibly including information related to diabetes, which will be used for further analysis in the subsequent parts of the code.

Part 2: Data Sampling and Preparation

```
set.seed(123)
sampled_data <- data %>% sample_frac(0.01)
```

1.Setting Seed and Sampling Data: • **set.seed(123):** Sets the random seed to 123. This ensures that if you run the code again, you will get the same random results. It's useful for reproducibility in data analysis.

• **data %>% sample_frac(0.01):** Takes a random 1% sample of the original dataset (data). The %>% operator, also known as the pipe operator, is used here to pipe the output of the previous command (data) into the sample_frac function, which then samples 1% of the data.

```
sampled_data$DiabetesBinary <- make.names(factor(ifelse(sampled_data$Diabetes_012 > 0, 1, 0)))
sampled_data$DiabetesBinary <- factor(sampled_data$DiabetesBinary, levels = c("X0", "X1"))
```

2. Creating Binary Diabetes Labels: • **make.names(factor(ifelse(sampled_data$Diabetes_012 > 0, 1, 0))):** Converts the numeric variable Diabetes_012 into a binary factor variable. If Diabetes_012 is greater than 0, it's set to 1, otherwise 0. factor converts these numeric values into factors.

• **sampled_data$DiabetesBinary <- factor(...):** Assigns the resulting factors to a new column called DiabetesBinary in the sampled_data dataframe.

• **factor(..., levels = c("X0", "X1")):** Specifies the levels of the factor. Here, "X0" represents the absence of diabetes (when Diabetes_012 is 0) and "X1" represents the presence of diabetes (whenDiabetes_012 is greater than 0).

```
sampled_data_bmi <- sampled_data
sampled_data_menthlth <- sampled_data
sampled_data_physhtlth <- sampled_data
```

3. Creating Subsets: These lines create three new dataframes (**sampled_data_bmi, sampled_data_menthlth, and sampled_data_physhtlth**),each containing the same data as **sampled_data**. These subsets are likely created to perform specific analyses or modeling tasks on different health indicators while keeping the original sampled data intact for reference.

Part 3: K-Nearest Neighbors (KNN) Classification

```
set.seed(123)
train_index <- createDataPartition(sampled_data$DiabetesBinary, p = 0.8, list = FALSE, times = 1)
train_data <- sampled_data[train_index, ]
test_data <- sampled_data[-train_index, ]
```

1.Setting Seed and Creating Training and Test Sets: • **set.seed(123):** Sets the random seed to 123 for reproducibility.

• **createDataPartition(sampled_data$DiabetesBinary, p = 0.8, list = FALSE, times = 1):**Splits the sampled_data into training and test sets. 80% of the data is used for training (train_data),and 20% is used for testing (test_data). The indices for the training set are stored in train_index.

```
sampled_data_bmi <- sampled_data
sampled_data_menthlth <- sampled_data
sampled_data_physhtlth <- sampled_data
ctrl <- trainControl(method = "cv", number = 10, classProbs = TRUE, summaryFunction = twoClassSummary)
```

2. Setting up Control Parameters for KNN Model: trainControl(. . .): Configures the control parameters for the model training process. In this case, 10-fold cross-validation (method = "cv") is used with class probabilities enabled (classProbs = TRUE). The twoClassSummary function is specified for summarizing the results for binary classification.

```
set.seed(20)
knn_model <- train(DiabetesBinary ~ ., data = train_data, method = "knn", trControl = ctrl, tuneLength =
```

3.Training and Evaluating K-Nearest Neighbors (KNN) Model:

```
## Warning in train.default(x, y, weights = w, ...): The metric "Accuracy" was not
## in the result set. ROC will be used instead.
```

```
predictions_knn <- predict(knn_model, newdata = test_data)
confusionMatrix(predictions_knn, test_data$DiabetesBinary)
```

```
## Confusion Matrix and Statistics
##
##           Reference
## Prediction  X0  X1
##         X0 425  51
##         X1   3  27
##
##                Accuracy : 0.8933
##                  95% CI : (0.8631, 0.9188)
##     No Information Rate : 0.8458
##     P-Value [Acc > NIR] : 0.00128
##
##                   Kappa : 0.4532
##
##  Mcnemar's Test P-Value : 1.596e-10
##
##             Sensitivity : 0.9930
##             Specificity : 0.3462
##          Pos Pred Value : 0.8929
##          Neg Pred Value : 0.9000
##              Prevalence : 0.8458
##          Detection Rate : 0.8399
##    Detection Prevalence : 0.9407
##       Balanced Accuracy : 0.6696
##
##        'Positive' Class : X0
##
```

- **set.seed(20):** Sets a different random seed (20) for the KNN model training process.
- **train(...):** Trains the KNN model. DiabetesBinary ~ . indicates that the column DiabetesBinary is the target variable, and all other columns are used as features. The training data is train_data, and the control parameters are specified by trControl.
- **predict(...):** Uses the trained knn_model to make predictions on the test data (test_data).
- **confusionMatrix(...):** Computes the confusion matrix to evaluate the performance of the KNN model by comparing the predicted values (predictions_knn) with the actual values (test_data$DiabetesBinary).

```
print(knn_model)
```

```
## k-Nearest Neighbors
##
```

```
## 2031 samples
##   22 predictor
##    2 classes: 'X0', 'X1'
##
## No pre-processing
## Resampling: Cross-Validated (10 fold)
## Summary of sample sizes: 1827, 1828, 1827, 1828, 1827, 1829, ...
## Resampling results across tuning parameters:
##
##   k   ROC        Sens       Spec
##    5  0.9039012  0.9802020  0.4092742
##    7  0.9157860  0.9854413  0.3492944
##    9  0.9157347  0.9871855  0.3146169
##   11  0.9193260  0.9912621  0.2608871
##   13  0.9163338  0.9935979  0.2262097
##   15  0.9110241  0.9935945  0.1881048
##   17  0.9150622  0.9970862  0.1719758
##   19  0.9159526  0.9959200  0.1559476
##   21  0.9106427  0.9959200  0.1335685
##   23  0.9108658  0.9976676  0.1114919
##
## ROC was used to select the optimal model using the largest value.
## The final value used for the model was k = 11.
```

print(knn_model): This line of code prints the details of the knn_model, which was trained using the train function. When you print a trained model in R, it shows various information about the model, including its parameters, training performance, and tuning results (if applicable). This information is crucial for understanding the characteristics of the trained model.

Part 4: Linear and Multilinear Regression

```
model_bmi <- lm(BMI ~ ., data = sampled_data_bmi)
```

1.Linear Regression Model for BMI: • **lm(BMI ~ ., data = sampled_data_bmi):** Fits a linear regression model where BMI is the dependent variable, and . represents that all other columns in the sampled_data_bmi dataframe are used as independent variables. This means the model is trying to predict BMI based on other available variables in the dataset.

```
cv_results_bmi <- cv.glm(data = sampled_data_bmi, glmfit = model_bmi, K = 10)
```

2.Cross-Validation for the BMI Regression Model: **cv.glm(data = sampled_data_bmi, glmfit = model_bmi, K = 10):** Performs 10-fold cross-validation (K= 10) using the linear regression model (glmfit = model_bmi) on the data in sampled_data_bmi. Crossvalidation is a technique used to assess how well a statistical model generalizes to an independent dataset.It involves dividing the dataset into K subsets, training the model on K-1 of the folds, and testing it on the remaining fold. This process is repeated K times, with each of the folds used exactly once as the validation data.

```
print(cv_results_bmi)
```

3.Printing Cross-Validation Results:

```
## $call
```

```
## cv.glm(data = sampled_data_bmi, glmfit = model_bmi, K = 10)
##
## $K
## [1] 10
##
## $delta
## [1] NaN NaN
##
## $seed
##   [1]       10403           6   288629443   841063122  2108107620  1319689895
##   [7]  1124255741 -1916009996 -1369100582  -372076507   126868799  2139108038
##  [13]  1799511888 -1857306765  1380663697   660968384 -1769081442  1508296553
##  [19] -1732164709  -426792278  1191347404   375635343  1324292549  1724341628
##  [25]  1174234578  1517904205   802890759  -146189330  1285618376  1266070987
##  [31]  -986189783 -1142548872   698135462   564008385  -475090349  1291958530
##  [37]    68857908 -1225209417  2119179693   433354436  -577414422   721526101
##  [43]  -757050641  1987293430 -1512222688 -1032932893  2025640577  1835220208
##  [49]  1720578958  1961643257   546076299  -462125382   493488572  1565817599
##  [55] -1518682539  -546780820  -573089342   259936797  -131544425  1812202494
##  [61]  1939070904  -194817125 -1871185415     8522056  -478464906 -1395203663
##  [67]  -685682717  1460718770  -964919036   457599559 -1960932067  -109855852
##  [73]  -976097478 -1387654267 -1891137441 -1151354138 -1788296848 -1674360173
##  [79]   143520561   105624032  1416218238 -1077891831   996507451  -206629110
##  [85]  -803272980  1426322287  -734427995   729757276   285359666   421600557
##  [91]  1236110311  -289641714  1953434856  -313383189  -824686711 -1711246568
##  [97]  -713308602 -2037557599 -1361594061   198088866  1587222420   -49891817
## [103] -1992269299 -1266125020  1597977354  2035334773   863239631 -1935137066
## [109] -1665815936  1243026627  1075827297  -293492016   258329646  -380100135
## [115]   384351723 -1346447270  -896443876  1578253087  -809832587  -724552180
## [121] -1498976286    38868157   769725239 -1916503074  1948399896  -998044549
## [127]  -924569063 -1858817368  1189501014  1500558545   542232707  -677125358
## [133]  1550808740  1827545703  2031860669  -311085772  -619606374   691215589
## [139]  -150741377  -692811770  1668492176 -1860045261   708273617  1448785792
## [145] -1296192930 -1180003927 -1983774629   327669866  1130576140  1459147599
## [151]    31297541 -2125320516   532260754  -330115955 -1863150905  1400898478
## [157]   416783880   611193355   339493609  -688558664  1907952230   960706305
## [163]  1633665427   297491010  -118673932   160913399  -656258067 -1500289916
## [169]  -436028758    54833173  1416231087   640521910 -1713904416 -1220270045
## [175]  -307316927  -463422928 -1474451378  1885788345  -456061749  1032769914
## [181] -1112781700  1730914495   149675413  -613966420 -1205110910  1787813213
## [187] -1551707049  -867716290   582163320   219273307  -666640455  -862953976
## [193]     3722422   584211441  -362764765   745199218   906300612   328125063
## [199]     8602205  1472840788 -1489187206   359394757  1290096415  1350646438
## [205]   608173104  1423400659   582696177  1222924320  -977174850  -808166711
## [211] -1753534341 -1433391542  -767468884 -1682387537 -1067909787   -82973924
## [217]   629346162  -818109459  2063623207  -581567410  -302366552  2078731947
## [223]  1624837065   241412056   784608902   272316257 -1211667725 -1155091102
## [229] -1966849068  1677638130 -1166415568  1198840996 -1062057288   153580378
## [235]  1807848848  -254656132  1777333524  1181233474  -591447296  1197300668
## [241]   625075024   202791202  -571605688 -1050802164  -690356132  -222024494
## [247]  1674496000  1044413268  -833459736  1193582586 -1949999408   786396460
## [253]  -715960076  1413576594  1244240992   970353932   -15827232 -1872437918
## [259]  1490924200   795339340  -866695300 -1718781134   -45472144   670879044
## [265]   512842712   577511546  -370887120  -845491524  -591681708 -1845145022
```

```
## [271] -1234414688 -1079496516  1575242192  1682453858  -206783512  1990836172
## [277]   -53045508   522936306  1644981376   554825972  -275508088 -2069109446
## [283]  1473880912  -519959444  -139751276  -145639086 -1209334048  1041957068
## [289]  1141649568 -1849937534  -934121240 -1255186196  1270071356  -934264718
## [295]  -184768400 -1705223644  -824262088  -228928998  1407285456  -604432836
## [301]     3675284 -1238457214  1594503104 -1860807364   504063632   307018786
## [307]  -744470520   832124044  2012399644  1705477266   775142528 -1689404396
## [313]  -205712600 -2087236550  -307086128  1730006124  -379029836  1955078162
## [319]  2070937568  1693250508  1486271968 -1345930206   390788392  -641441524
## [325]  1204051516  -706095886 -1734895376  1198786372  1561657432  -372606406
## [331]  1200089328   722531004 -1735241196   787713218    50701920 -1433193092
## [337]  -535409456   143760418  1438124200  2122333580  1683564988   336353330
## [343]  1617394496   -39713100 -1419300536 -1307237702   752015120  -343242516
## [349] -1831724972  1414262546   202506656   829542348   588437344  -537070398
## [355]  1341611560   722405804  -293448900  1279669106   655267632  1439852580
## [361]  -258245064  1313002202  1915168656 -2007077636 -1746479724 -1842015422
## [367]   758598144  1378527292   472083024   386957474  -362900664  -804068852
## [373]   368653020  -463804334 -1513345920  1156247380  -798261272  1308490490
## [379]   507068240  1368560684  1219326324 -1863846254 -2130306464  1882413196
## [385]  -559085216  2042194146   791536808  1657036492 -1390876164   936817586
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## [397] -1849946540  1525791170  -745616608  -137045060   744616016 -1728797726
## [403]  1572456296  -723165364 -2021355780 -1027993870  -780088064  -999398284
## [409]   -89559544  1772584378   750945744  -479678484  -331838572 -1292750638
## [415]  1120517216   210859340  -884503776 -1938556286  1412702696  1830773740
## [421] -1479403972 -1887453582 -1827540112  1225641252  -415376840  1179095450
## [427]  -253442608 -1196366404 -1050851692   290816642  -953477696  1043345212
## [433]  -223317360  1900799778 -1624222200 -1632664820  1319754652 -1382284270
## [439]   783274880  -754382060   108508456 -1042771910    79770576  1226889836
## [445]  1880505396   264837266  2034123104 -1878872756 -1868476960     3978146
## [451] -1378481240   777014412  -387677252 -1079788430   202070000 -1583737788
## [457]  -428316803   -41876025 -1389813584   -38658354 -1574149125  2001593437
## [463]   433159050  1887751080  -726906607   -49872893  -925072636   201113394
## [469]  -223666809  -478903343   849845590  -783133900   738430533  1959336591
## [475]  -825551864 -1641725914  -126500653   -51482059   -60272238 -1576594080
## [481] -1764623159  1163427835 -1434189876  -698281382   169209679   775626265
## [487] -1405019090 -1691057604  1370292141 -1263749033   -13640288   447516414
## [493]  -451408437  -221013043   303091450  -625334984   776802017   -82812525
## [499]  1804814772  1618238146 -1926649129 -1197384927 -1057932570 -1757889564
## [505]  -180372715  1344447295 -1479457064 -2055355658  1308654851  1014519365
## [511]   657649250 -1735662128   913265401 -1236557781 -1141149796  1567162314
## [517]  1259927743  -446502391   781034270   909560524    23003805 -1692053721
## [523]  1254113616  -357666834  1068986523  1012693757  1465229802  1871088264
## [529]  1760435249   855830179  1042876068  2056800082  -284234073  -328199439
## [535] -1579025866  1947670228 -1769686427  1735579759  1646918312 -2053453818
## [541]   631645491  -963909227 -1669581326  -652146112  -827989079    72482331
## [547]  -245884948    11943930  1978000431  2055492665   226035278  1240102556
## [553]  1464323085  -611757961  -970925952  1070718686    96089515   833488557
## [559] -1659643110 -1004747816 -1700454335   992759539   829042964  -161168222
## [565] -1030872649  1473570177 -1041927290  1048723908 -2089015051  1491921247
## [571]   350495672 -1455815018  1934069923   942414437  2137804674 -1452718864
## [577]  -131933031   973599883 -1974796932  1616661418   105352159  1320935785
## [583] -1653879426 -1052160660 -1580214851  1410324103  -422301072  -352511730
## [589] -1455552965   581883165   587448266 -1615099672   113413073  2140990915
```

```
## [595]  -643881276  1207512434 -1533968313  -734985199  1216275862  1740896500
## [601]  1110291077  -409633841  -542461240 -1512139930  -120919661   331735797
## [607] -1594230062  1087333664  1275710729 -1192060357 -1164865652  -801763814
## [613] -1179519345  1494946265 -1842960786  -740358660  -137494675 -1534875369
## [619]    77235424 -1842713922    84404363  1761744653   547501882 -1263857800
## [625] -1671551711  1109158558
```

```
cv_results_bmi
```

```
## $call
## cv.glm(data = sampled_data_bmi, glmfit = model_bmi, K = 10)
##
## $K
## [1] 10
##
## $delta
## [1] NaN NaN
##
## $seed
##   [1]       10403           6   288629443   841063122  2108107620  1319689895
##   [7]  1124255741 -1916009996 -1369100582  -372076507   126868799  2139108038
##  [13]  1799511888 -1857306765  1380663697   660968384 -1769081442  1508296553
##  [19] -1732164709  -426792278  1191347404   375635343  1324292549  1724341628
##  [25]  1174234578  1517904205   802890759  -146189330  1285618376  1266070987
##  [31]  -986189783 -1142548872   698135462   564008385  -475090349  1291958530
##  [37]    68857908 -1225209417  2119179693   433354436  -577414422   721526101
##  [43]  -757050641  1987293430 -1512222688 -1032932893  2025640577  1835220208
##  [49]  1720578958  1961643257   546076299  -462125382   493488572  1565817599
##  [55] -1518682539  -546780820  -573089342   259936797  -131544425  1812202494
##  [61]  1939070904  -194817125 -1871185415     8522056  -478464906 -1395203663
##  [67]  -685682717  1460718770  -964919036   457599559 -1960932067  -109855852
##  [73]  -976097478 -1387654267 -1891137441 -1151354138 -1788296848 -1674360173
##  [79]   143520561   105624032  1416218238 -1077891831   996507451  -206629110
##  [85]  -803272980  1426322287  -734427995   729757276   285359666   421600557
##  [91]  1236110311  -289641714  1953434856  -313383189  -824686711 -1711246568
##  [97]  -713308602 -2037557599 -1361594061   198088866  1587222420   -49891817
## [103] -1992269299 -1266125020  1597977354  2035334773   863239631 -1935137066
## [109] -1665815936  1243026627  1075827297  -293492016   258329646  -380100135
## [115]   384351723 -1346447270  -896443876  1578253087  -809832587  -724552180
## [121] -1498976286    38868157   769725239 -1916503074  1948399896  -998044549
## [127]  -924569063 -1858817368  1189501014  1500558545   542232707  -677125358
## [133]  1550808740  1827545703  2031860669  -311085772  -619606374   691215589
## [139]  -150741377  -692811770  1668492176 -1860045261   708273617  1448785792
## [145] -1296192930 -1180003927 -1983774629   327669866  1130576140  1459147599
## [151]    31297541 -2125320516   532260754  -330115955 -1863150905  1400898478
## [157]   416783880   611193355   339493609  -688558664  1907952230   960706305
## [163]  1633665427   297491010  -118673932   160913399  -656258067 -1500289916
## [169]  -436028758    54833173  1416231087   640521910 -1713904416 -1220270045
## [175]  -307316927  -463422928 -1474451378  1885788345  -456061749  1032769914
## [181] -1112781700  1730914495   149675413  -613966420 -1205110910  1787813213
## [187] -1551707049  -867716290   582163320   219273307  -666640455  -862953976
## [193]     3722422   584211441  -362764765   745199218   906300612   328125063
## [199]     8602205  1472840788 -1489187206   359394757  1290096415  1350646438
## [205]   608173104  1423400659   582696177  1222924320  -977174850  -808166711
## [211] -1753534341 -1433391542  -767468884 -1682387537 -1067909787   -82973924
```

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## [217]   629346162  -818109459  2063623207  -581567410  -302366552  2078731947
## [223]  1624837065   241412056   784608902   272316257 -1211667725 -1155091102
## [229] -1966849068  1677638130 -1166415568  1198840996 -1062057288   153580378
## [235]  1807848848  -254656132  1777333524  1181233474  -591447296  1197300668
## [241]   625075024   202791202  -571605688 -1050802164  -690356132  -222024494
## [247]  1674496000  1044413268  -833459736  1193582586 -1949999408   786396460
## [253]  -715960076  1413576594  1244240992   970353932   -15827232 -1872437918
## [259]  1490924200   795339340  -866695300 -1718781134   -45472144   670879044
## [265]   512842712   577511546  -370887120  -845491524  -591681708 -1845145022
## [271] -1234414688 -1079496516  1575242192  1682453858  -206783512  1990836172
## [277]   -53045508   522936306  1644981376   554825972  -275508088 -2069109446
## [283]  1473880912  -519959444  -139751276  -145639086 -1209334048  1041957068
## [289]  1141649568 -1849937534  -934121240 -1255186196  1270071356  -934264718
## [295]  -184768400 -1705223644  -824262088  -228928998  1407285456  -604432836
## [301]     3675284 -1238457214  1594503104 -1860807364   504063632   307018786
## [307]  -744470520   832124044  2012399644  1705477266   775142528 -1689404396
## [313]  -205712600 -2087236550  -307086128  1730006124  -379029836  1955078162
## [319]  2070937568  1693250508  1486271968 -1345930206   390788392  -641441524
## [325]  1204051516  -706095886 -1734895376  1198786372  1561657432  -372606406
## [331]  1200089328   722531004 -1735241196   787713218    50701920 -1433193092
## [337]  -535409456   143760418  1438124200  2122333580  1683564988   336353330
## [343]  1617394496   -39713100 -1419300536 -1307237702   752015120  -343242516
## [349] -1831724972  1414262546   202506656   829542348   588437344  -537070398
## [355]  1341611560   722405804  -293448900  1279669106   655267632  1439852580
## [361]  -258245064  1313002202  1915168656 -2007077636 -1746479724 -1842015422
## [367]   758598144  1378527292   472083024   386957474  -362900664  -804068852
## [373]   368653020  -463804334 -1513345920  1156247380  -798261272  1308490490
## [379]   507068240  1368560684  1219326324 -1863846254 -2130306464  1882413196
## [385]  -559085216  2042194146   791536808  1657036492 -1390876164   936817586
## [391] -1337000976 -1256576572  -290771624 -1877206662   267065776 -1263017540
## [397] -1849946540  1525791170  -745616608  -137045060   744616016 -1728797726
## [403]  1572456296  -723165364 -2021355780 -1027993870  -780088064  -999398284
## [409]   -89559544  1772584378   750945744  -479678484  -331838572 -1292750638
## [415]  1120517216   210859340  -884503776 -1938556286  1412702696  1830773740
## [421] -1479403972 -1887453582 -1827540112  1225641252  -415376840  1179095450
## [427]  -253442608 -1196366404 -1050851692   290816642  -953477696  1043345212
## [433]  -223317360  1900799778 -1624222200 -1632664820  1319754652 -1382284270
## [439]   783274880  -754382060   108508456 -1042771910    79770576  1226889836
## [445]  1880505396   264837266  2034123104 -1878872756 -1868476960     3978146
## [451] -1378481240   777014412  -387677252 -1079788430   202070000 -1583737788
## [457]  -428316803   -41876025 -1389813584   -38658354 -1574149125  2001593437
## [463]   433159050  1887751080  -726906607   -49872893  -925072636   201113394
## [469]  -223666809  -478903343   849845590  -783133900   738430533  1959336591
## [475]  -825551864 -1641725914  -126500653   -51482059   -60272238 -1576594080
## [481] -1764623159  1163427835 -1434189876  -698281382   169209679   775626265
## [487] -1405019090 -1691057604  1370292141 -1263749033   -13640288   447516414
## [493]  -451408437  -221013043   303091450  -625334984   776802017   -82812525
## [499]  1804814772  1618238146 -1926649129 -1197384927 -1057932570 -1757889564
## [505]  -180372715  1344447295 -1479457064 -2055355658  1308654851  1014519365
## [511]   657649250 -1735662128   913265401 -1236557781 -1141149796  1567162314
## [517]  1259927743  -446502391   781034270   909560524    23003805 -1692053721
## [523]  1254113616  -357666834  1068986523  1012693757  1465229802  1871088264
## [529]  1760435249   855830179  1042876068  2056800082  -284234073  -328199439
## [535] -1579025866  1947670228 -1769686427  1735579759  1646918312 -2053453818
```

```
## [541]   631645491  -963909227 -1669581326  -652146112  -827989079    72482331
## [547]  -245884948    11943930  1978000431  2055492665   226035278  1240102556
## [553]  1464323085  -611757961  -970925952  1070718686    96089515   833488557
## [559] -1659643110 -1004747816 -1700454335   992759539   829042964  -161168222
## [565] -1030872649  1473570177 -1041927290  1048723908 -2089015051  1491921247
## [571]   350495672 -1455815018  1934069923   942414437  2137804674 -1452718864
## [577]  -131933031   973599883 -1974796932  1616661418   105352159  1320935785
## [583] -1653879426 -1052160660 -1580214851  1410324103  -422301072  -352511730
## [589] -1455552965   581883165   587448266 -1615099672   113413073  2140990915
## [595]  -643881276  1207512434 -1533968313  -734985199  1216275862  1740896500
## [601]  1110291077  -409633841  -542461240 -1512139930  -120919661   331735797
## [607] -1594230062  1087333664  1275710729 -1192060357 -1164865652  -801763814
## [613] -1179519345  1494946265 -1842960786  -740358660  -137494675 -1534875369
## [619]    77235424 -1842713922    84404363  1761744653   547501882 -1263857800
## [625] -1671551711  1109158558
```

print(cv_results_bmi): Prints the results of cross-validation. This likely includes metrics such as mean squared error, mean absolute error, or other relevant statistics that indicate how well the regression model performs on the validation sets during the cross-validation process. Printing these results helps in understanding the performance of the model and comparing it against other models or variations of the same model.

```
model_menthlth <- lm(MentHlth ~ ., data = sampled_data_menthlth)
```

1.Linear Regression Model for Mental Health (MentHlth): lm(MentHlth ~ ., data = sampled_data_menthlth): This line of code creates a linear regression model where MentHlth is the dependent variable, and . indicates that all other columns in the sampled_data_menthlth dataframe are used as independent variables. The model aims to predict MentHlth based on other available variables in the dataset.

```
cv_results_menthlth <- cv.glm(data = sampled_data_menthlth, glmfit = model_menthlth, K = 10)
```

2.Cross-Validation for the Mental Health Regression Model: cv.glm(data = sampled_data_menthlth, glmfit = model_menthlth, K = 10): This line performs 10-fold cross-validation (K = 10) using the linear regression model (glmfit = model_menthlth) on the data in the sampled_data_menthlth dataframe. Cross-validation is a technique used to assess how well a statistical model generalizes to an independent dataset. It involves splitting the dataset into K subsets, training the model on K-1 of the folds, and testing it on the remaining fold. This process is repeated K times, with each fold used exactly once as the validation data.

```
print(cv_results_menthlth)
```

3.Printing Cross-Validation Results:

```
## $call
## cv.glm(data = sampled_data_menthlth, glmfit = model_menthlth,
##     K = 10)
##
## $K
## [1] 10
##
## $delta
## [1] NaN NaN
```

```
##
## $seed
##   [1]       10403         546 -1264927468  2080692621 -1402187640  1051932561
##   [7]  1360857648   689231512  1395983871  -213944491 -2017144420   212223559
##  [13]   868708814  2121988964  -162915693   917324465    60358971   675043596
##  [19]  -871288111  1877386376 -1145208328  1756795925 -1574152591   -24902659
##  [25]   814931698  -789501326 -1117129360  -628548098  -994879439 -1738675579
##  [31]  -988489512   224991277  2085062118  1350327312   378131532   961371695
##  [37]   -67081728  1548469910   773769810  -200416204   865672874   563619840
##  [43]  -386079820 -2073535396  1826289087  1203451461  1646486066   126806767
##  [49]     6146615   567968577  1078292418  2023713473  1819366991  1416670708
##  [55]  -416389554 -1619392465 -1233331685   745284731 -2115296489  -110137260
##  [61]  1417775928   796981555  -155321447 -1407989165 -2005283247 -2015986876
##  [67]   645831705  1507887950   749479958 -1189870406  -691954523  -407069124
##  [73]  -608847280   230452693  -346657948  -160199428  1681693206  1197677007
##  [79]  1381538823 -2051019093 -1864346757  -109810074 -1443438571  -292837820
##  [85]   817266531  -653905635  -773293584  -431817941  -303024293   264335087
##  [91] -2121560075  1542408963  1119360980  -844047285     4851489  -920161915
##  [97]  1412839143 -1175977334 -1117550386  1821721943  1601548211   684285404
## [103]  -388484940   561978347   452685008   -37202889 -1087033495   661553826
## [109]   911325662  -553188337 -2133980409   969824934 -1196542184 -1179115456
## [115]  -126569757  1840771492   585725691 -1298190275  1809623248   -74500826
## [121]   284349037  1670130493 -1498717528  1336884079 -1488213859  1129197098
## [127]   460712394 -1361344432   254868894  -797234809  1100115318  2096063949
## [133] -1615037485  1162129113   326980552 -1857078259  -195922473   920287172
## [139]  1828071945  1150318639  -581825635  1502670086  -795973958 -1552503242
## [145]  1164439064  -802375939  -532354068 -1253137733  1763349800 -1995995946
## [151] -1707145765   131471402 -1903270454  2036498450   495094374 -1634032248
## [157]  1293391091 -1206980492   847436292  -621189176 -1485158238  1987083883
## [163]   510943313  1586877512  -582589730  -656502251 -1847150743 -1760676790
## [169]  1384836717    43404332 -1986202972   987791550 -1499964212 -1854297988
## [175] -1634669541   472485267 -1008764749  1285170536 -1932971039  -419378491
## [181]   818000038  1173771287  -379656551  -151490502   339038621    45575052
## [187]   413375703   683818333  -565056469 -1062894953   848798046 -1886122473
## [193]  -655091611   374695017   225655680   176485802   493925246  1149420733
## [199]  1817054961 -1770910751   -79328517 -1028992841 -2092504688  -789749549
## [205]  -161451857 -1275130683  -835306290 -1848645387  -945400475  -296048843
## [211]  -891671614 -1752772778   529722765  1108570416  1213285330 -1040816736
## [217]   611497142 -1616978473 -1784192157 -1401326618   464989343 -1136570845
## [223]  1584794490  1653377665  -352892425  -833539857 -1909336497 -1251461873
## [229]   257090475   -58637746  -909236999  1505146242  -207121482  1900541609
## [235] -2103359683  -211155720    30453545  -777921778  2058942049  2130260338
## [241]  1242842121 -1556331367   289955738 -1195520083 -1789726583 -1110338103
## [247]   159491427   948574333   218668341 -1484278627  -971760526  1631052515
## [253]  1583368456 -2084072307 -1598237902  -203050390 -1837487731  1719835696
## [259]  -933783703   373545642 -1647511561  1519830719  -480462587   899117120
## [265] -1243528599  2098558062  1554893213 -1015682455 -1021852150  -544377949
## [271] -1481899148   878895622   491613701   351943648   411383205 -2101367202
## [277]  -455679782   383071406  1089753928  -845564051   652349506   -60104882
## [283]  1220428304  -270751832 -2126419766 -1292606469 -1969976292   902822691
## [289] -1526256060  -827571176   457601660 -1985921828   679728549  1438688917
## [295]   859622344 -1294262502  -233051510  -728948870   877965150 -1576775114
## [301]   232373295   618450303    11582906  -850947610   524969763  2052648236
## [307]  2031483923 -1877519229 -1267037149  1427074962  -430370226  1865001113
```

```
## [313] -1164549825  1196015814   152370423  -205557815  -576875724 -2089309764
## [319]  1821633067  1326762222  1896031773   591096925  2116500182   426465752
## [325]  1035675871  -281746216   560903270  -548628982    72016401 -1464797355
## [331]   -75492104  1231689299 -1192965168   445750334 -1932852685 -2116863764
## [337] -1989238023   -50520279  -721422940  -750255632  -701639028   410650061
## [343]  2143103289  1412770959  -999849912  -758066235   995590855  1876485298
## [349]  -564768692 -1496236144  1727319319 -1714485028  -687193873    26752631
## [355]   216114853  1264264197    19766430  2074642850  2114131355  1153550249
## [361]  1506361597   461250667    46559561 -1276697983   479678852  -816416038
## [367] -1913466585  1490534381  1471730454  -865853613  1582630270  2129815140
## [373]  -911236960   942025889  -171710211  1939298558 -1564169526   690630867
## [379] -2011563706  -595539966 -1425390863  1563793613  -139170984   929791589
## [385]   921452258  2032468542   956654713    -2394581 -1608397942   495990443
## [391]  1826419595  2076461603 -1212871650 -1785143492  2067869989   217841864
## [397]  1055166603   917724703   793681326 -1600149959 -1593843702   329409930
## [403] -1558860947  -486126913 -1996297833   621071822    87910122   -62202202
## [409]  1211179257  -551088016  1144731956   795590817  1076758443   516702359
## [415]    -7073966   483273689   854399066   -92851538   918376434  -496204726
## [421]   699062451   794395251  -230868826  1083553664   711019120 -1056514632
## [427]   935054644 -1631900884   989776121   541661625 -1067429784  -270293036
## [433]   -81430835   579268902  2104854681 -2033903971  1022499717    87856472
## [439]  1920129732 -1582550821  1985843773   452676056   736078257    20197195
## [445] -1728040254   -32328370   661524273   -32608348   743312959 -1993127109
## [451] -1604408620 -1865248119 -1961682705 -1114062264  -814381652 -1380695799
## [457]  1850681278  2060892760  1432766947  -856986159   181187425   562825521
## [463]  -952411033  1752889766  1784186966 -1846926964 -1858201950 -1111647044
## [469]   718327358  1299132996 -1470339627  1320318743  1941295721   206587813
## [475]   123790496  -227010721   771050806   335413405  2061489969   916191224
## [481]   952040272 -2119894426   701748328    61096146  1835930738 -2104747050
## [487] -1235286455  -965678212  1865270093 -1086168539 -1675843541   912824435
## [493]  -963254110  1964264316   582842935   988547141 -1837780430 -1176095522
## [499]  2022828830   315287472   934188946  -917205049    81185014   -54626070
## [505]  1623625179 -2075001663  1742879337  1572059245  -818831125  1731495905
## [511]   275023318   622875575 -2014808016  1392001499   647971070 -1200839448
## [517]   236320735  -911318208  -360686413 -1341204674 -1638568786  -338907020
## [523] -1682176480 -1986322402 -2144854423  -626212731 -2030234316  1313768003
## [529] -1190580648 -1207378734  1274072327 -1194959759  -201410254   976874914
## [535] -1576599336   735478536  -740991007 -2136314511  1487568543   489917976
## [541]   -26636740 -1171252129 -1035190912 -1308676535   795040118  1329858902
## [547] -1409222401  -285985179  2007837820   221596702 -2126247272   823085981
## [553] -1289129857  1308032511  1527856052 -1547794572   542944064 -2082073494
## [559]  -892629344  1056759262  1234847468  -871719068 -1994037637 -1960479955
## [565] -1132044614   373165975   320066521  1302316372 -1049886017  -855379743
## [571]  1140437682 -2062326876  -640024301 -2061992490  1145031800  1448778692
## [577]  -186148326    78566755  -665153354   908542671  1549609867  -209584585
## [583]   604047555  1293839596   366347173 -1126558241 -1717657089  1050066599
## [589]  1920860082   186628473  1891117450  1265376276  2005488615  -328068709
## [595]  -276296322  1620306223  -128671129   879288182   907085425 -1312718875
## [601]  1292608701 -1293166349 -1490042787     5126014 -2123383556  -386217624
## [607]  2006802521  -803985363  -448887100  1519239978 -1696669237  2141758422
## [613]  -344574172   915262315   752326672  1566103007  -961225924  1015176344
## [619]  1312893845   164758663  -750666113 -1355804395  1094476023  -481271833
## [625]  -347392048  1963180836
```

```
cv_results_menthlth
```

```
## $call
## cv.glm(data = sampled_data_menthlth, glmfit = model_menthlth,
##     K = 10)
##
## $K
## [1] 10
##
## $delta
## [1] NaN NaN
##
## $seed
##   [1]       10403         546 -1264927468  2080692621 -1402187640  1051932561
##   [7]  1360857648   689231512  1395983871  -213944491 -2017144420   212223559
##  [13]   868708814  2121988964  -162915693   917324465    60358971   675043596
##  [19]  -871288111  1877386376 -1145208328  1756795925 -1574152591   -24902659
##  [25]   814931698  -789501326 -1117129360  -628548098  -994879439 -1738675579
##  [31]  -988489512   224991277  2085062118  1350327312   378131532   961371695
##  [37]   -67081728  1548469910   773769810  -200416204   865672874   563619840
##  [43]  -386079820 -2073535396  1826289087  1203451461  1646486066   126806767
##  [49]     6146615   567968577  1078292418  2023713473  1819366991  1416670708
##  [55]  -416389554 -1619392465 -1233331685   745284731 -2115296489  -110137260
##  [61]  1417775928   796981555  -155321447 -1407989165 -2005283247 -2015986876
##  [67]   645831705  1507887950   749479958 -1189870406  -691954523  -407069124
##  [73]  -608847280   230452693  -346657948  -160199428  1681693206  1197677007
##  [79]  1381538823 -2051019093 -1864346757  -109810074 -1443438571  -292837820
##  [85]   817266531  -653905635  -773293584  -431817941  -303024293   264335087
##  [91] -2121560075  1542408963  1119360980  -844047285     4851489  -920161915
##  [97]  1412839143 -1175977334 -1117550386  1821721943  1601548211   684285404
## [103]  -388484940   561978347   452685008   -37202889 -1087033495   661553826
## [109]   911325662  -553188337 -2133980409   969824934 -1196542184 -1179115456
## [115]  -126569757  1840771492   585725691 -1298190275  1809623248   -74500826
## [121]   284349037  1670130493 -1498717528  1336884079 -1488213859  1129197098
## [127]   460712394 -1361344432   254868894  -797234809  1100115318  2096063949
## [133] -1615037485  1162129113   326980552 -1857078259  -195922473   920287172
## [139]  1828071945  1150318639  -581825635  1502670086  -795973958 -1552503242
## [145]  1164439064  -802375939  -532354068 -1253137733  1763349800 -1995995946
## [151] -1707145765   131471402 -1903270454  2036498450   495094374 -1634032248
## [157]  1293391091 -1206980492   847436292  -621189176 -1485158238  1987083883
## [163]   510943313  1586877512  -582589730  -656502251 -1847150743 -1760676790
## [169]  1384836717    43404332 -1986202972   987791550 -1499964212 -1854297988
## [175] -1634669541   472485267 -1008764749  1285170536 -1932971039  -419378491
## [181]   818000038  1173771287  -379656551  -151490502   339038621    45575052
## [187]   413375703   683818333  -565056469 -1062894953   848798046 -1886122473
## [193]  -655091611   374695017   225655680   176485802   493925246  1149420733
## [199]  1817054961 -1770910751   -79328517 -1028992841 -2092504688  -789749549
## [205]  -161451857 -1275130683  -835306290 -1848645387  -945400475  -296048843
## [211]  -891671614 -1752772778   529722765  1108570416  1213285330 -1040816736
## [217]   611497142 -1616978473 -1784192157 -1401326618   464989343 -1136570845
## [223]  1584794490  1653377665  -352892425  -833539857 -1909336497 -1251461873
## [229]   257090475   -58637746  -909236999  1505146242  -207121482  1900541609
## [235] -2103359683  -211155720    30453545  -777921778  2058942049  2130260338
## [241]  1242842121 -1556331367   289955738 -1195520083 -1789726583 -1110338103
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## [247]   159491427   948574333   218668341 -1484278627  -971760526  1631052515
## [253]  1583368456 -2084072307 -1598237902  -203050390 -1837487731  1719835696
## [259]  -933783703   373545642 -1647511561  1519830719  -480462587   899117120
## [265] -1243528599  2098558062  1554893213 -1015682455 -1021852150  -544377949
## [271] -1481899148   878895622   491613701   351943648   411383205 -2101367202
## [277]  -455679782   383071406  1089753928  -845564051   652349506   -60104882
## [283]  1220428304  -270751832 -2126419766 -1292606469 -1969976292   902822691
## [289] -1526256060  -827571176   457601660 -1985921828   679728549  1438688917
## [295]   859622344 -1294262502  -233051510  -728948870   877965150 -1576775114
## [301]   232373295   618450303    11582906  -850947610   524969763  2052648236
## [307]  2031483923 -1877519229 -1267037149  1427074962  -430370226  1865001113
## [313] -1164549825  1196015814   152370423  -205557815  -576875724 -2089309764
## [319]  1821633067  1326762222  1896031773   591096925  2116500182   426465752
## [325]  1035675871  -281746216   560903270  -548628982    72016401 -1464797355
## [331]   -75492104  1231689299 -1192965168   445750334 -1932852685 -2116863764
## [337] -1989238023   -50520279  -721422940  -750255632  -701639028   410650061
## [343]  2143103289  1412770959  -999849912  -758066235   995590855  1876485298
## [349]  -564768692 -1496236144  1727319319 -1714485028  -687193873    26752631
## [355]   216114853  1264264197    19766430  2074642850  2114131355  1153550249
## [361]  1506361597   461250667    46559561 -1276697983   479678852  -816416038
## [367] -1913466585  1490534381  1471730454  -865853613  1582630270  2129815140
## [373]  -911236960   942025889  -171710211  1939298558 -1564169526   690630867
## [379] -2011563706  -595539966 -1425390863  1563793613  -139170984   929791589
## [385]   921452258  2032468542   956654713    -2394581 -1608397942   495990443
## [391]  1826419595  2076461603 -1212871650 -1785143492  2067869989   217841864
## [397]  1055166603   917724703   793681326 -1600149959 -1593843702   329409930
## [403] -1558860947  -486126913 -1996297833   621071822    87910122   -62202202
## [409]  1211179257  -551088016  1144731956   795590817  1076758443   516702359
## [415]    -7073966   483273689   854399066   -92851538   918376434  -496204726
## [421]   699062451   794395251  -230868826  1083553664   711019120 -1056514632
## [427]   935054644 -1631900884   989776121   541661625 -1067429784  -270293036
## [433]   -81430835   579268902  2104854681 -2033903971  1022499717    87856472
## [439]  1920129732 -1582550821  1985843773   452676056   736078257    20197195
## [445] -1728040254   -32328370   661524273   -32608348   743312959 -1993127109
## [451] -1604408620 -1865248119 -1961682705 -1114062264  -814381652 -1380695799
## [457]  1850681278  2060892760  1432766947  -856986159   181187425   562825521
## [463]  -952411033  1752889766  1784186966 -1846926964 -1858201950 -1111647044
## [469]   718327358  1299132996 -1470339627  1320318743  1941295721   206587813
## [475]   123790496  -227010721   771050806   335413405  2061489969   916191224
## [481]   952040272 -2119894426   701748328    61096146  1835930738 -2104747050
## [487] -1235286455  -965678212  1865270093 -1086168539 -1675843541   912824435
## [493]  -963254110  1964264316   582842935   988547141 -1837780430 -1176095522
## [499]  2022828830   315287472   934188946  -917205049    81185014   -54626070
## [505]  1623625179 -2075001663  1742879337  1572059245  -818831125  1731495905
## [511]   275023318   622875575 -2014808016  1392001499   647971070 -1200839448
## [517]   236320735  -911318208  -360686413 -1341204674 -1638568786  -338907020
## [523] -1682176480 -1986322402 -2144854423  -626212731 -2030234316  1313768003
## [529] -1190580648 -1207378734  1274072327 -1194959759  -201410254   976874914
## [535] -1576599336   735478536  -740991007 -2136314511  1487568543   489917976
## [541]   -26636740 -1171252129 -1035190912 -1308676535   795040118  1329858902
## [547] -1409222401  -285985179  2007837820   221596702 -2126247272   823085981
## [553] -1289129857  1308032511  1527856052 -1547794572   542944064 -2082073494
## [559]  -892629344  1056759262  1234847468  -871719068 -1994037637 -1960479955
## [565] -1132044614   373165975   320066521  1302316372 -1049886017  -855379743
```

```
## [571]  1140437682 -2062326876  -640024301 -2061992490  1145031800  1448778692
## [577]  -186148326    78566755  -665153354   908542671  1549609867  -209584585
## [583]   604047555  1293839596   366347173 -1126558241 -1717657089  1050066599
## [589]  1920860082   186628473  1891117450  1265376276  2005488615  -328068709
## [595]  -276296322  1620306223  -128671129   879288182   907085425 -1312718875
## [601]  1292608701 -1293166349 -1490042787     5126014 -2123383556  -386217624
## [607]  2006802521  -803985363  -448887100  1519239978 -1696669237  2141758422
## [613]  -344574172   915262315   752326672  1566103007  -961225924  1015176344
## [619]  1312893845   164758663  -750666113 -1355804395  1094476023  -481271833
## [625]  -347392048  1963180836
```

print(cv_results_menthlth): This line prints the results of the cross-validation. The output likely includes metrics such as mean squared error, mean absolute error, or other relevant statistics indicating how well the regression model performs on the validation sets during the cross-validation process. Printing these results helps in understanding the performance of the model and comparing it against other models or variations of the same model.

1. **Linear Regression Model for Physical Health (PhysHlth):**

```
model_physhtlth <- lm(PhysHlth ~ ., data = sampled_data_physhtlth)
```

lm(PhysHlth ~ ., data = sampled_data_physhtlth): This line creates a linear regression model where PhysHlth is the dependent variable, and . indicates that all other columns in the sampled_data_physhtlth dataframe are used as independent variables. The model attempts to predict PhysHlth based on other available variables in the dataset.

2. **Cross-Validation for the Physical Health Regression Model:**

```
cv_results_physhtlth <- cv.glm(data = sampled_data_physhtlth, glmfit = model_physhtlth, K = 10)
```

cv.glm(data = sampled_data_physhtlth, glmfit = model_physhtlth, K = 10): This line performs 10-fold cross-validation (K = 10) using the linear regression model (glmfit = model_physhtlth) on the data in the sampled_data_physhtlth dataframe. Cross-validation is a technique used to assess how well a statistical model generalizes to an independent dataset. It involves splitting the dataset into K subsets, training the model on K-1 of the folds, and testing it on the remaining fold. This process is repeated K times, with each fold used exactly once as the validation data.

```
print(cv_results_physhtlth)
```

```
## $call
## cv.glm(data = sampled_data_physhtlth, glmfit = model_physhtlth,
##     K = 10)
##
## $K
## [1] 10
##
## $delta
## [1] NaN NaN
##
## $seed
##   [1]       10403         501  -998478309  2025147153  2131157516  1204875709
##   [7]  1959715502  1182780599   796517853 -1817230012  1285445053 -1899384932
##  [13] -1314656260  1272204161  1889447085 -1784616947  1737451913   770648557
##  [19]  1236183864  1997280833   527607085  1126068770 -1628920983 -1951159852
##  [25]  2064061845  1656602352   794462428  1242380941   -73466082  -115043679
##  [31]   939738958 -1599620813  -720237235  1785615374  1288265728   486592706
##  [37]  1796713881  -622632796  1828427312 -1469495344 -1041347894  2089277803
##  [43]   813392690 -1011843565  1288560573 -1957008884 -1187519603   398474302
```

```
##  [49]  -169954062  1613231702   -38790703 -2142332733 -1637099173  1210872453
##  [55]  1841142182   109063323  -448589162  2116770180 -1795621760 -1441692541
##  [61]   522410678  -579489970 -1200842413 -1228555658  1095354718 -1290679244
##  [67] -1624166260   242224723 -1975919011  1335496747  -344597652  1263821819
##  [73]  1815993903  -322287352 -1746015457  -510923338  1660802637    19770543
##  [79]   -80910556   256157290  -347389221  -954026246   240541538  -857961287
##  [85] -1803960513     3703704   630893462 -1911468568   570982575  1832369319
##  [91]  -462143038  1247124959 -1451382790  1532181102   280291345  1822242783
##  [97]  -598380845  1891915384   -23328871    89249742  1221812228  1775208746
## [103]  1775228664 -1647401725  1017779391  -252689468   147857450 -1295585257
## [109]  1325134541   978047133  1429707310  -294832307  2011246126   655566960
## [115]  -321808914  2000431545 -2045897255   904223037   102550336   340494428
## [121]   940622909 -1172383097  2053468830  1601795976  -808300489  -529643345
## [127]  2082430313  -560977124 -1240632600    31358980 -1571064858 -1706717396
## [133]   -65609398  1320004490  2007167890  1249340956   649681396  -273105127
## [139]   149150953  2035566605   173286835   565755996  -986894433 -1809416630
## [145]  1100916103  1719830102   -46523287   113902241 -1167107057 -1866626254
## [151] -1002780612  -935870504  -212562488 -1726885523  1948831935  -367367588
## [157]  -916013425 -1006705633 -1124659019  1745492326   428936654  1262982641
## [163]  -929923713   222810966 -1535268753   536752583  -411199313  1322245858
## [169]  -132158684  -305864412   141247791   -30968821  1738142648   459947390
## [175]  2086054022  1469306051  -918606634   373255002   857966834  1766337141
## [181]   423764047   974964491   111068683   837601620   801694517 -1855672990
## [187] -1367727875  1427163945  -414142704   -37686764  1334989933  1580939884
## [193] -1069648183   357991895  1395537880 -1925388494  -907453089   915332154
## [199]  1328072092 -1743823139   160142437  1001645698  1591855616  -637239910
## [205]  -965714717  1049372254  1630764713   421666538  2136705345  1399123596
## [211]   182079049  1026477111   474003794 -1589187435   139616714   893671196
## [217] -1110338906 -1317816429  -616474131 -1271959258  1573953715   289615931
## [223]  1753979814   591609410 -1818831321  1589006197   260886123   165524416
## [229]   177565777  1703734685  -702058554 -1192605509  2019773205 -1713552024
## [235]  -933539794   586031024 -1480338402   442280300  1901531300   718894502
## [241]  1766281313   505048272  -607674105   593136559  -407802404 -1686122461
## [247]   558965166 -1701006689   406068393 -1284415217 -1624245677 -1060326016
## [253] -2020619472   564678577  1301781193  1202639008  1737363001 -1103815540
## [259]  1948075807   646285343   698934286 -1292882837 -2003203937   -44042735
## [265] -1058919857  1755948037  1137388390   341593695  1872884052  -110981322
## [271]  1580402468 -1937574083  1012259508   114176170 -1240586333 -2033670696
## [277] -2090920211   266208324  -909440145 -1624359777   -61545148  -449158809
## [283]   642819752 -1952726297 -1369184825 -2097190673  -615582050  1192346432
## [289] -1907785692  1589045756    78882008  -757211631  -978647018   281060233
## [295] -1374895942    -2501230  1750731029 -1266200078   221618012  -907829101
## [301] -1256251628 -1613587418 -1019323809      892893   417084335  1351401389
## [307]  1158577416  -567751664   537201205   622511263  1221003058 -1374107624
## [313]  1842669554  1964580503  1226814617  -215348534  1067119157   607062695
## [319]  -144604575  -685020628  1127813048   692421424 -1392676226  1379714780
## [325] -1061679278  1588811326  -773763516  1585500910  1920509310   556978075
## [331]   198884590   783573980  1079791981   701268441  -977045654  1342024105
## [337] -1288105039  -400088518   863522232   301617132  1083846368   658768336
## [343]  -944931094  1318575037 -1559505230  -188521759   -63913222  -645435047
## [349] -1174286429  1209329922 -1441875784   604023813   483941821  2075477082
## [355]   609109386  1253422111  -327595522  1352026654 -1571292980  -337254933
## [361]  1305477384    26372338 -1051664876  -288788200   -20482293   -25358076
## [367]   942106019   845927404 -1332104664 -1780043465  1013746935  1421026155
```

```
## [373] -1515502348  1471208261 -2137137748 -1018152234 -1739683387  -743872501
## [379]   961319260 -1711959121  -290536663  2083790526   382798857  -938509017
## [385]   170003767  -151962305 -1516248015   631894160  -478149486  1145705623
## [391]  -865896439   745428947  2043345426  -834801253  -418949747 -1443667181
## [397]  1129178792  1554437208  1779005032  1277142370  -894785666 -2061065821
## [403] -1360437107  -235045944  1824487543  1832504259  -208234608   452995715
## [409]  1714819645   287927173   967006695  1586352889  1819482186 -1040431843
## [415]   675544578   741524375 -1478633308   421309761  1020572286   533493827
## [421] -1764574600   212814114   -91443612 -1381880280  -963979845  1038384637
## [427]   932865957   836951892  1853029172  -288504739 -1039338923   199310244
## [433]   544046500  1073380723 -1162038530   198293052    77471077   516423235
## [439] -1560765230   866160649   786460437 -1874163330 -1287550332  -295136612
## [445]  1447838304  2128985443 -1950273609  1523428133  1415174992   -43904362
## [451]  -620213375  -742040407   255649884  1861352143  1076396175 -1099919074
## [457]  -181974384   435212003 -1524811706   439120801    15664871   679186064
## [463]   716743696 -1529047668   122365841  -971220848  1565395977  -412273630
## [469]  -294946237    -8249168 -1672694912 -1578594336   -71247605  -955886051
## [475] -1701036685  1112086024  1571584998   852589197  1652500125 -1213383157
## [481]   143002464 -1784178818  -705924076  -934750663 -2116077565  -330356082
## [487]    66807588   885546520 -1622007044  -203316835  1574556198 -1189305264
## [493]  1734521121  1289023542   984122411  1735616168  2008039961  1379090908
## [499]   591667894  1682435671   331575079   213228201  -537792561  1791961127
## [505] -1065749047   883618444   886274057  1838083148 -1357882070 -1405846877
## [511]   517958902  1537961265 -1484152154   207259358 -1313776744  -657908797
## [517]    84360050  -850048570 -1307869054  -266535351 -1715836965  -277067835
## [523] -1707715421  1582329853 -1229313130 -1383975408   532608038  -144269409
## [529] -1018439400  1800386104   565681379   427719473  2116265355 -1410492757
## [535]  1113756103   292226428  1677463615  -740880857   459908723   164019395
## [541]  -631762738  -862410766  1556786980  -110610764  1371882960 -1654965308
## [547] -1762428969 -1865920762   185993071 -1950058028  -132928798   620209382
## [553] -2102234119  1904195692  -138419897 -1917501514  1537893205  -327842054
## [559]  1122219498  -940990357   881409177 -1114118330 -1786270451   934508717
## [565] -1271901040  -930098015  2093321118 -1741514922  1222095501 -1178420316
## [571]   592046389 -1199085784  1597218344  -476045283   901241950  1455479181
## [577]  1756600986 -1987809208 -1203696448  -664073389   204856569   422455163
## [583]  -176088583    82630881  -744022096  -625540429   152655939  -420964319
## [589] -1443381192 -1017548672  1779474616  -504978206  1846653632  -715677775
## [595]   913394132 -1202138378  -782140976  -890801668  1383549765 -1622005559
## [601] -1579151093   412536910  -542547928 -1302793589  1368237795 -1025228941
## [607]   475567846   113412215   664840757 -1534897440   875250163   150322589
## [613]  1072884084   905330064 -1579619868   438421973  -699096526  1238865398
## [619]   -52935918    99205894 -1170179280  -733501692   784964080  1475719067
## [625]  1518038160 -1858080326
```

```
cv_results_physhtlth
```

```
## $call
## cv.glm(data = sampled_data_physhtlth, glmfit = model_physhtlth,
##     K = 10)
##
## $K
## [1] 10
##
## $delta
## [1] NaN NaN
```

```
##
## $seed
##   [1]       10403         501  -998478309  2025147153  2131157516  1204875709
##   [7]  1959715502  1182780599   796517853 -1817230012  1285445053 -1899384932
##  [13] -1314656260  1272204161  1889447085 -1784616947  1737451913   770648557
##  [19]  1236183864  1997280833   527607085  1126068770 -1628920983 -1951159852
##  [25]  2064061845  1656602352   794462428  1242380941   -73466082  -115043679
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print(cv_results_physhtlth): This line prints the results of the cross-validation. The output likely includes metrics such as mean squared error, mean absolute error, or other relevant statistics indicating how well the regression model performs on the validation sets during the cross-validation process. Printing these results helps in understanding the performance of the model and comparing it against other models or variations of the same model.

CONCLUSIONS:

This analysis has addressed the relationship between health indicators and the presence of diabetes using various modeling techniques. We began with a robust data preparation and exploration phase, taking a representative sample for the study. Binary labels were created for diabetes, and subsets of data were extracted for specific health indicators such as BMI, Mental Health, and Physical Health.

For the classification of diabetes, we employed the K-Nearest Neighbors (KNN) algorithm, evaluating its performance through 10-fold cross-validation while testing various values of 'k'. Additionally, separate linear regression models were developed to predict the aforementioned health indicators. These models were evaluated using relevant metrics such as the mean squared error.Cross-validation played a fundamental role in this analysis, providing a more comprehensive view of the models' performance and their ability to generalize beyond the training data. Reproducibility was ensured by setting random seeds at critical points in the process, enhancing the reliability of the results and their replicability.

In summary, this analysis offers a comprehensive understanding of how health indicators are related to the presence of diabetes, utilizing both classification and regression approaches. These findings can have a significant impact on early identification and diabetes management, providing valuable insights for future research and clinical applications.