# GPH 2338 Project

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## Data Upload

```
library(haven)
library(psych)
library(caret)
library(tidyverse)
library(ggplot2)
library(psych)
library(pander)
library(corrplot)
library(readr)
library(readr)
library(redr)
```

#### **Data Preparation**

```
df<-readr::read_tsv("brca_metabric_clinical_data.tsv")</pre>
```

```
## Rows: 2509 Columns: 39
## -- Column specification ------
## Delimiter: "\t"
## chr (27): Study ID, Patient ID, Sample ID, Type of Breast Surgery, Cancer Ty...
## dbl (12): Age at Diagnosis, Cohort, Neoplasm Histologic Grade, Lymph nodes e...
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
```

# colnames(df)

```
##
   [1] "Study ID"
                                         "Patient ID"
##
   [3] "Sample ID"
                                         "Age at Diagnosis"
  [5] "Type of Breast Surgery"
##
                                         "Cancer Type"
  [7] "Cancer Type Detailed"
                                         "Cellularity"
  [9] "Chemotherapy"
                                         "Pam50 + Claudin-low subtype"
##
## [11] "Cohort"
                                          "ER status measured by IHC"
## [13] "ER Status"
                                         "Neoplasm Histologic Grade"
## [15] "HER2 status measured by SNP6"
                                         "HER2 Status"
## [17] "Tumor Other Histologic Subtype" "Hormone Therapy"
```

```
## [19] "Inferred Menopausal State"
                                         "Integrative Cluster"
## [21] "Primary Tumor Laterality"
                                         "Lymph nodes examined positive"
## [23] "Mutation Count"
                                         "Nottingham prognostic index"
## [25] "Oncotree Code"
                                         "Overall Survival (Months)"
## [27] "Overall Survival Status"
                                         "PR Status"
## [29] "Radio Therapy"
                                         "Relapse Free Status (Months)"
## [31] "Relapse Free Status"
                                         "Number of Samples Per Patient"
## [33] "Sample Type"
                                         "Sex"
## [35] "3-Gene classifier subtype"
                                         "TMB (nonsynonymous)"
## [37] "Tumor Size"
                                         "Tumor Stage"
## [39] "Patient's Vital Status"
```

# colSums(is.na(df))

##	Study ID	Patient ID
##	0	0
##	Sample ID	Age at Diagnosis
##	0	11
##	Type of Breast Surgery	Cancer Type
##	554	0
##	Cancer Type Detailed	Cellularity
##	0	592
##	Chemotherapy	Pam50 + Claudin-low subtype
##	529	529
##	Cohort	ER status measured by IHC
##	11	83
##	ER Status	Neoplasm Histologic Grade
##	40	121
##	HER2 status measured by SNP6	HER2 Status
##	529	529
##	Tumor Other Histologic Subtype	Hormone Therapy
##	135	529
##	Inferred Menopausal State	Integrative Cluster
##	529	529
##	Primary Tumor Laterality	Lymph nodes examined positive
##	639	266
##	Mutation Count	Nottingham prognostic index
##	151	222
##	Oncotree Code	Overall Survival (Months)
##	0	528
##	Overall Survival Status	PR Status
##	528	529
##	Radio Therapy	Relapse Free Status (Months)
##	529	121
##	Relapse Free Status	Number of Samples Per Patient
##	21	0
##	Sample Type	Sex
##	0	0
##	3-Gene classifier subtype	TMB (nonsynonymous)
##	745	0
##	Tumor Size	Tumor Stage
##	149	721
##	Patient's Vital Status	
##	529	

## print(df)

```
# A tibble: 2,509 x 39
##
      'Study ID'
                    Patie~1 Sampl~2 Age a~3 Type ~4 Cance~5 Cance~6 Cellu~7 Chemo~8
##
      <chr>
                    <chr>
                             <chr>
                                       <dbl> <chr>
                                                     <chr>>
                                                              <chr>
                                                                      <chr>
                                                                              <chr>
##
                                                                              NO
    1 brca_metabric MB-0000 MB-0000
                                        75.6 MASTEC~ Breast~ Sreast~ <NA>
    2 brca_metabric MB-0002 MB-0002
                                        43.2 BREAST~ Breast~ Breast~ High
                                                                              NO
##
    3 brca_metabric MB-0005 MB-0005
                                        48.9 MASTEC~ Breast~ Breast~ High
                                                                              YES
##
    4 brca_metabric MB-0006 MB-0006
                                        47.7 MASTEC~ Breast~ Breast~ Modera~ YES
    5 brca_metabric MB-0008 MB-0008
                                        77.0 MASTEC~ Breast~ Breast~ High
                                                                              YES
    6 brca_metabric MB-0010 MB-0010
                                        78.8 MASTEC~ Breast~ Breast~ Modera~ NO
##
    7 brca metabric MB-0014 MB-0014
                                        56.4 BREAST~ Breast~ Breast~ Modera~ YES
   8 brca_metabric MB-0020 MB-0020
                                                                              YES
##
                                        70
                                             MASTEC~ Breast~ Breast~ High
    9 brca metabric MB-0022 MB-0022
                                        89.1 BREAST~ Breast~ Breast~ Modera~ NO
## 10 brca_metabric MB-0025 MB-0025
                                        76.2 <NA>
                                                     Breast~ Breast~ <NA>
                                                                              < N A >
     ... with 2,499 more rows, 30 more variables:
       'Pam50 + Claudin-low subtype' <chr>, Cohort <dbl>,
##
       'ER status measured by IHC' <chr>, 'ER Status' <chr>,
       'Neoplasm Histologic Grade' <dbl>, 'HER2 status measured by SNP6' <chr>,
## #
       'HER2 Status' <chr>, 'Tumor Other Histologic Subtype' <chr>,
## #
       'Hormone Therapy' <chr>, 'Inferred Menopausal State' <chr>,
## #
## #
       'Integrative Cluster' <chr>, 'Primary Tumor Laterality' <chr>, ...
```

# df1 <- df %>% na.omit() colSums(is.na(df1))

```
##
                          Study ID
                                                          Patient ID
##
                                  0
##
                          Sample ID
                                                   Age at Diagnosis
##
                                                         Cancer Type
           Type of Breast Surgery
##
##
                                  0
                                                                    0
##
             Cancer Type Detailed
                                                         Cellularity
##
##
                      Chemotherapy
                                       Pam50 + Claudin-low subtype
##
                                  0
                                                                    0
##
                             Cohort
                                          ER status measured by IHC
##
##
                         ER Status
                                          Neoplasm Histologic Grade
##
##
     HER2 status measured by SNP6
                                                         HER2 Status
##
   Tumor Other Histologic Subtype
##
                                                    Hormone Therapy
##
##
        Inferred Menopausal State
                                                Integrative Cluster
##
##
         Primary Tumor Laterality
                                     Lymph nodes examined positive
##
##
                    Mutation Count
                                       Nottingham prognostic index
##
##
                     Oncotree Code
                                          Overall Survival (Months)
##
          Overall Survival Status
                                                           PR Status
##
```

```
##
##
                    Radio Therapy
                                     Relapse Free Status (Months)
##
##
                                    Number of Samples Per Patient
              Relapse Free Status
##
##
                                                               Sex
                      Sample Type
##
                                                                 0
##
        3-Gene classifier subtype
                                              TMB (nonsynonymous)
##
##
                       Tumor Size
                                                       Tumor Stage
##
                                                                 0
##
           Patient's Vital Status
##
#df1<- df1[df1$`Cancer Type Detailed` == "Breast Invasive Ductal Carcinoma",]
df2<-df1[,-c(1, 2, 3, 6)] # remove StudyID, Patient ID, Sample ID, Cancer Type
print(df2)
## # A tibble: 1,092 x 35
      Age at Diagn~1 Type ~2 Cance~3 Cellu~4 Chemo~5 Pam50~6 Cohort ER st~7 ER St~8
##
##
                                                      <chr>
                                                                <dbl> <chr>
               <dbl> <chr>
                              <chr>
                                      <chr>>
                                              <chr>
                                                                              <chr>>
##
   1
                43.2 BREAST~ Breast~ High
                                              NO
                                                      LumA
                                                                    1 Positve Positi~
   2
                77.0 MASTEC~ Breast~ High
##
                                              YES
                                                      LumB
                                                                    1 Positve Positi~
##
  3
                78.8 MASTEC~ Breast~ Modera~ NO
                                                      LumB
                                                                    1 Positve Positi~
##
                86.4 BREAST~ Breast~ Modera~ NO
                                                      LumB
                                                                    1 Positve Positi~
                84.2 MASTEC~ Breast~ High
                                                                    1 Negati~ Positi~
##
  5
                                              NO
                                                      Her2
##
    6
                85.5 MASTEC~ Breast~ Modera~ NO
                                                      LumA
                                                                    1 Positve Positi~
##
   7
                45.4 BREAST~ Breast~ High
                                              YES
                                                      LumB
                                                                    1 Positve Positi~
                61.5 BREAST~ Breast~ High
                                              NO
                                                      LumB
                                                                    1 Positve Positi~
##
                68.7 MASTEC~ Breast~ Low
                                              YES
##
   9
                                                      Basal
                                                                    1 Negati~ Negati~
                46.9 MASTEC~ Breast~ Modera~ NO
                                                      Normal
                                                                    1 Positve Positi~
## 10
    ... with 1,082 more rows, 26 more variables:
       'Neoplasm Histologic Grade' <dbl>, 'HER2 status measured by SNP6' <chr>,
       'HER2 Status' <chr>, 'Tumor Other Histologic Subtype' <chr>,
## #
       'Hormone Therapy' <chr>, 'Inferred Menopausal State' <chr>,
## #
## #
       'Integrative Cluster' <chr>, 'Primary Tumor Laterality' <chr>,
       'Lymph nodes examined positive' <dbl>, 'Mutation Count' <dbl>,
## #
       'Nottingham prognostic index' <dbl>, 'Oncotree Code' <chr>, ...
## #
dim(df2)
## [1] 1092
              35
is_categorical <- sapply(df2, is.character)</pre>
is_categorical
##
                 Age at Diagnosis
                                           Type of Breast Surgery
##
                             FALSE
                                                              TRUE
##
             Cancer Type Detailed
                                                       Cellularity
##
                              TRUE
                                                              TRUE
##
                     Chemotherapy
                                      Pam50 + Claudin-low subtype
```

```
TRUE
##
                                                                TRUE
##
                            Cohort
                                         ER status measured by IHC
##
                             FALSE
                                                               TRUE
                         ER Status
##
                                         Neoplasm Histologic Grade
##
                              TRUE
                                                              FALSE
     HER2 status measured by SNP6
                                                        HER2 Status
##
                                                               TRUE
##
##
   Tumor Other Histologic Subtype
                                                    Hormone Therapy
##
                              TRUE
                                                                TRUE
##
        Inferred Menopausal State
                                               Integrative Cluster
##
                              TRUE
                                                               TRUE
##
         Primary Tumor Laterality
                                     Lymph nodes examined positive
##
                              TRUE
                                                              FALSE
##
                    Mutation Count
                                       Nottingham prognostic index
##
                             FALSE
                                                              FALSE
##
                     Oncotree Code
                                         Overall Survival (Months)
##
                              TRUE
                                                              FALSE
##
          Overall Survival Status
                                                          PR Status
##
                                                               TRUE
                              TRUE
##
                     Radio Therapy
                                      Relapse Free Status (Months)
##
                              TRUE
                                                              FALSE
##
              Relapse Free Status
                                     Number of Samples Per Patient
##
                              TRUE
                                                              FALSE
                       Sample Type
##
                                                                 Sex
                                                               TRUE
##
                              TRUE
##
        3-Gene classifier subtype
                                               TMB (nonsynonymous)
##
                              TRUE
                                                              FALSE
                        Tumor Size
##
                                                        Tumor Stage
                             FALSE
                                                              FALSE
##
           Patient's Vital Status
##
##
                              TRUE
```

Create Dummy Variable for Categorical Variable

```
df2 1 <- df2 %>%
 mutate(Type_of_Breast_Surgery_BREAST_CONSERVING =
           as.integer(df2$`Type of Breast Surgery` == "BREAST CONSERVING"))
df2_2 <- df2_1 %>%
  mutate(Type_of_Breast_Surgery_MASTECTOMY =
           as.integer(df2$`Type of Breast Surgery` == "MASTECTOMY"))
df2_3 <- df2_2 %>%
  mutate(Cellularity_High = as.integer(df2_2$Cellularity == "High"))
df2_4 <- df2_3 %>%
  mutate(Cellularity_Moderate = as.integer(df2_3$Cellularity == "Moderate"))
df2_5 <- df2_4 %>%
 mutate(Cellularity Low = as.integer(df2 4$Cellularity == "Low"))
df2_6 <- df2_5 %>%
  mutate(Chemotherapy_No = as.integer(df2_5$Chemotherapy == "NO"))
df2_7 <- df2_6 %>%
 mutate(Chemotherapy_Yes = as.integer(df2_6$Chemotherapy == "YES"))
df2 8 <- df2 7 %>%
```

```
mutate(Pam50_Claudin_low_subtype_LumA =
           as.integer(df2_7$`Pam50 + Claudin-low subtype` == "LumA"))
df2_9 <- df2_8 %>%
  mutate(Pam50_Claudin_low_subtype_LumB =
           as.integer(df2_8$`Pam50 + Claudin-low subtype` == "LumB"))
df2 10 <- df2 9 %>%
  mutate(Pam50_Claudin_low_subtype_Her2 =
           as.integer(df2 9$\text{Pam50} + Claudin-low subtype\text{ == "Her2")}
df2 11 <- df2 10 %>%
  mutate(Pam50 Claudin low subtype Basal =
           as.integer(df2_10\rightarrow Pam50 + Claudin-low subtype == "Basal"))
df2_12 <- df2_11 %>%
  mutate(Pam50 Claudin low subtype Normal =
           as.integer(df2_11$`Pam50 + Claudin-low subtype` == "Normal"))
df2 13 <- df2 12 %>%
  mutate(Pam50_Claudin_low_subtype_claudin_low =
           as.integer(df2_12$`Pam50 + Claudin-low subtype` == "claudin-low"))
df2_14 <- df2_13 %>%
  mutate(Pam50_Claudin_low_subtype_NC =
           as.integer(df2_13$`Pam50 + Claudin-low subtype` == "NC"))
df2_15 <- df2_14 %>%
  mutate(ER_status_measured_by_IHC_Positive =
           as.integer(df2_14\$`ER status measured by IHC` == "Positve"))
df2 16 <- df2 15 %>%
  mutate(ER_status_measured_by_IHC_Negative =
           as.integer(df2 15$`ER status measured by IHC` == "Negative"))
df2 17 <- df2 16 %>%
 mutate(ER_Status_Positive = as.integer(df2_16$`ER Status` == "Positive"))
df2_18 <- df2_17 %>%
  mutate(ER_Status_Negative = as.integer(df2_17$`ER_Status` == "Negative"))
df2_19 <- df2_18 %>%
  mutate(HER2_status_measured_by_SNP6_Neutral =
           as.integer(df2_18$`HER2 status measured by SNP6` == "NEUTRAL"))
df2_20 <- df2_19 %>%
  mutate(HER2_status_measured_by_SNP6_GAIN =
           as.integer(df2 19$`HER2 status measured by SNP6` == "GAIN"))
df2_21 <- df2_20 %>%
  mutate(HER2_status_measured_by_SNP6_LOSS =
           as.integer(df2 20$`HER2 status measured by SNP6` == "LOSS"))
df2 22 <- df2 21 %>%
  mutate(HER2_status_measured_by_SNP6_UNDEF =
           as.integer(df2_21$`HER2 status measured by SNP6` == "UNDEF"))
df2_23 <- df2_22 %>%
  mutate(HER2_Status_Positive = as.integer(df2_22$`HER2 Status` == "Positive"))
df2_24 <- df2_23 %>%
  mutate(HER2_Status_Negative = as.integer(df2_23$`HER2 Status` == "Negative"))
```

```
df2_25 <- df2_24 %>%
  mutate(Tumor_Other_Histologic_Subtype_DN=
           as.integer(df2_24\^Tumor Other Histologic Subtype\^ == "Ductal/NST"))
df2 26 <- df2 25 %>%
  mutate(Tumor_Other_Histologic_Subtype_Mixed =
           as.integer(df2 25$`Tumor Other Histologic Subtype` == "Mixed"))
df2_27 <- df2_26 %>%
  mutate(Tumor Other Histologic Subtype Lobular =
           as.integer(df2 26$`Tumor Other Histologic Subtype` == "Lobular"))
df2_28 <- df2_27 %>%
  mutate(Tumor_Other_Histologic_Subtype_TC =
           as.integer(df2_27$`Tumor Other Histologic Subtype` == "Tubular/ cribriform"))
df2_29 <- df2_28 %>%
  mutate(Tumor_Other_Histologic_Subtype_Mucinous =
           as.integer(df2_28*Tumor Other Histologic Subtype == "Mucinous"))
df2_30 <- df2_29 %>%
  mutate(Tumor_Other_Histologic_Subtype_Medullary =
           as.integer(df2_29$`Tumor Other Histologic Subtype` == "Medullary"))
df2_31 <- df2_30 %>%
  mutate(Tumor_Other_Histologic_Subtype_Other =
           as.integer(df2 30$`Tumor Other Histologic Subtype` == "Other"))
df2_32 <- df2_31 %>%
 mutate(Hormone_Therapy_No = as.integer(df2_31$`Hormone Therapy` == "NO"))
df2 33 <- df2 32 %>%
  mutate(Hormone_Therapy_Yes = as.integer(df2_32$`Hormone Therapy` == "YES"))
df2_34 <- df2_33 %>%
  mutate(Inferred_Menopausal_State_Pre =
           as.integer(df2_33$`Inferred Menopausal State` == "Pre"))
df2_35 <- df2_34 %>%
  mutate(Inferred_Menopausal_State_Post =
           as.integer(df2_34\$`Inferred Menopausal State` == "Post"))
df2_36 <- df2_35 %>%
  mutate(Primary_Tumor_Laterality_Right =
           as.integer(df2_35$`Primary Tumor Laterality` == "Right"))
df2 37 <- df2 36 %>%
  mutate(Primary_Tumor_Laterality_left =
           as.integer(df2_36$`Primary Tumor Laterality` == "Left"))
df2_38 <- df2_37 %>%
  mutate(Oncotree_Code_IDC = as.integer(df2_37$`Oncotree Code` == "IDC"))
df2_39 <- df2_38 %>%
  mutate(Oncotree_Code_MDLC = as.integer(df2_38$`Oncotree Code` == "MDLC"))
df2_40 <- df2_39 %>%
  mutate(Oncotree_Code_ILC = as.integer(df2_39$`Oncotree Code` == "ILC"))
df2_41 <- df2_40 %>%
  mutate(Oncotree_Code_IMMC = as.integer(df2_40$`Oncotree Code` == "IMMC"))
df2_42 <- df2_41 %>%
  mutate(Oncotree_Code_BREAST = as.integer(df2_41$`Oncotree Code` == "BREAST"))
df2_43 <- df2_42 %>%
```

```
mutate(Overall_Survival_Status_0 =
           as.integer(df2 42$\cdot Overall Survival Status\) == "0:LIVING"))
df2_44 \leftarrow df2_43 \%
  mutate(Overall_Survival_Status_1 =
           as.integer(df2_43$`Overall Survival Status` == "1:DECEASED"))
df2_45 <- df2_44 %>%
  mutate(PR Status Positive = as.integer(df2 44$`PR Status` == "Positive"))
df2 46 <- df2 45 %>%
  mutate(PR Status Negative = as.integer(df2 45$`PR Status` == "Negative"))
df2_47 <- df2_46 %>%
  mutate(Radio_Therapy_No = as.integer(df2_46$`Radio Therapy` == "NO"))
df2_48 <- df2_47 %>%
  mutate(Radio_Therapy_Yes = as.integer(df2_47$`Radio_Therapy` == "YES"))
df2_49 <- df2_48 %>%
  mutate(Relapse_Free_Status_0 =
           as.integer(df2_48$`Relapse Free Status` == "0:Not Recurred"))
df2_50 <- df2_49 %>%
  mutate(Relapse_Free_Status_1 =
           as.integer(df2_49$`Relapse Free Status` == "1:Recurred"))
df2 51 <- df2 50 %>%
  mutate(Gene classifier subtype ERH =
           as.integer(df2_50$`3-Gene classifier subtype` == "ER+/HER2- High Prolif"))
df2_52 <- df2_51 %>%
  mutate(Gene_classifier_subtype_ERL =
           as.integer(df2_51$`3-Gene classifier subtype` == "ER+/HER2- Low Prolif"))
df2_53 <- df2_52 %>%
  mutate(Gene_classifier_subtype_ERM =
           as.integer(df2_52$`3-Gene classifier subtype` == "ER-/HER2-"))
df2_54 \leftarrow df2_53 \%
  mutate(Gene_classifier_subtype_HER =
           as.integer(df2_53$^3-Gene classifier subtype == "HER2+"))
df2_55 <- df2_54 %>%
  mutate(Patients_Vital_Status_L =
           as.integer(df2 54$`Patient's Vital Status` == "Living"))
df2_56 <- df2_55 %>%
  mutate(Patients_Vital_Status_D =
           as.integer(df2 55$\text{Patient's Vital Status}\text{ == "Died of Disease")}
df2 57 <- df2 56 %>%
  mutate(Patients_Vital_Status_D0 =
           as.integer(df2_56$`Patient's Vital Status` == "Died of Other Causes"))
df2_58 <- df2_57 %>%
  mutate(Integrative_Cluster_4p =
           as.integer(df2_57$`Integrative Cluster` == "4ER+"))
df2_59 <- df2_58 %>%
  mutate(Integrative_Cluster_9 = as.integer(df2_58$`Integrative Cluster` == "9"))
df2_60 <- df2_59 %>%
```

```
mutate(Integrative_Cluster_7 = as.integer(df2_59$`Integrative Cluster` == "7"))
df2_61 <- df2_60 %>%
  mutate(Integrative_Cluster_3 = as.integer(df2_60$`Integrative Cluster` == "3"))
df2_62 <- df2_61 %>%
  mutate(Integrative_Cluster_10 = as.integer(df2_61$`Integrative Cluster` == "10"))
df2_63 <- df2_62 %>%
  mutate(Integrative_Cluster_8 = as.integer(df2_62$`Integrative Cluster` == "8"))
df2 64 <- df2 63 %>%
 mutate(Integrative_Cluster_6 = as.integer(df2_63$`Integrative Cluster` == "6"))
df2_65 <- df2_64 %>%
  mutate(Integrative_Cluster_1 = as.integer(df2_64$`Integrative Cluster` == "1"))
df2_66 <- df2_65 %>%
  mutate(Integrative_Cluster_2 = as.integer(df2_65$`Integrative Cluster` == "2"))
df2_67 <- df2_66 %>%
  mutate(Integrative_Cluster_5 = as.integer(df2_66$`Integrative Cluster` == "5"))
df2_68 <- df2_67 %>%
  mutate(Integrative_Cluster_4m =
           as.integer(df2_67$`Integrative Cluster` == "4ER-"))
df2_69 <- df2_68 %>%
  mutate(Cancer_Type_Detailed=
           df2$`Cancer Type Detailed`)
```

Create Dummy Variable for Numeric Variable

```
df2_70 <- df2_69 %>%
  mutate(Age_at_Diagnosis = df2_69$`Age at Diagnosis`)
df2_71 <- df2_70 %>%
  mutate(Neo_Grade = df2_70$`Neoplasm Histologic Grade`)
df2_72 <- df2_71 %>%
 mutate(Lymph = df2_71$`Lymph nodes examined positive`)
df2_73 <- df2_72 %>%
 mutate(Mutation = df2_72$`Mutation Count`)
df2_74 <- df2_73 %>%
 mutate(Nottingham = df2_73$`Nottingham prognostic index`)
df2_75 <- df2_74 %>%
  mutate(Overall_Month = df2_74$`Overall Survival (Months)`)
df2_76 <- df2_75 %>%
 mutate(Relapse_Month = df2_75$`Relapse Free Status (Months)`)
df2_77 <- df2_76 %>%
 mutate(TMB = df2_76$`TMB (nonsynonymous)`)
df2_78 <- df2_77 %>%
  mutate(Tumor_Size = df2_77$`Tumor Size`)
df2_79 <- df2_78 %>%
 mutate(Tumor_Stage = df2_78$`Tumor Stage`)
df3 \leftarrow df2 79[,-c(1:35)]
```

pander(summary(df3),caption='Descriptive Statistics of The Data')

Table 1: Descriptive Statistics of The Data (continued below)

Type_of_Breast_Surgery_BREAST_CONSERVING	${\bf Type\_of\_Breast\_Surgery\_MASTECTOMY}$
Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 1.0000
Mean $:0.4231$	Mean $:0.5769$
3rd Qu.:1.0000	3rd Qu.:1.0000
Max. $:1.0000$	Max. $:1.0000$

Table 2: Table continues below

Cellularity_High	$Cellularity\_Moderate$	Cellularity_Low	Chemotherapy_No
Min. :0.0000	Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:1.0000
Median : 1.0000	Median: 0.0000	Median: 0.0000	Median $:1.0000$
Mean $:0.5092$	Mean $:0.3773$	Mean $:0.1136$	Mean $:0.7793$
3rd Qu.:1.0000	3rd Qu.:1.0000	3rd Qu.:0.0000	3rd Qu.:1.0000
Max. :1.0000	Max. :1.0000	Max. :1.0000	Max. :1.0000

Table 3: Table continues below

Chemotherapy_Yes	$Pam 50\_Claudin\_low\_subtype\_Lum A$
Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 0.0000
Mean $:0.2207$	Mean $:0.4057$
3rd Qu.:0.0000	3rd Qu.:1.0000
Max. :1.0000	Max. :1.0000

Table 4: Table continues below

Pam50_Claudin_low_subtype_LumB	Pam50_Claudin_low_subtype_Her2
Min. :0.0000	Min. :0.00000
1st Qu.:0.0000	1st Qu.:0.00000
Median: 0.0000	Median $:0.00000$
Mean $:0.2491$	Mean $:0.09249$
3rd Qu.:0.0000	3rd Qu.:0.00000
Max. $:1.0000$	Max. $:1.00000$

Table 5: Table continues below

$Pam 50\_Claudin\_low\_subtype\_Basal$	$Pam 50\_Claudin\_low\_subtype\_Normal$
Min. :0.00000	Min. :0.00000
1st Qu.:0.00000	1st Qu.:0.00000
Median $:0.00000$	Median: 0.00000
Mean $: 0.09341$	Mean $: 0.06227$

Pam50_Claudin_low_subtype_Basal	Pam50_Claudin_low_subtype_Normal
3rd Qu.:0.00000	3rd Qu.:0.00000
Max. $:1.00000$	Max. $:1.00000$

Table 6: Table continues below

Pam50_Claudin_low_subtype_claudin_low	Pam50_Claudin_low_subtype_NC
Min. :0.00000	Min. :0.000000
1st Qu.:0.00000	1st Qu.:0.000000
Median $:0.00000$	Median $:0.000000$
Mean $:0.09524$	Mean $:0.001832$
3rd Qu.:0.00000	3rd Qu.:0.000000
Max. :1.00000	Max. :1.000000

Table 7: Table continues below

$ER\_status\_measured\_by\_IHC\_Positive$	$ER\_status\_measured\_by\_IHC\_Negative$
Min. :0.0000	Min. :0.0000
1st Qu.:1.0000	1st Qu.:0.0000
Median :1.0000	Median: 0.0000
Mean $: 0.7747$	Mean $:0.2253$
3rd Qu.:1.0000	3rd Qu.:0.0000
Max. :1.0000	Max. :1.0000

Table 8: Table continues below

ER_Status_Positive	ER_Status_Negative	${\rm HER2\_status\_measured\_by\_SNP6\_Neutral}$
Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:1.0000	1st Qu.:0.0000	1st Qu.:0.0000
Median : 1.0000	Median: 0.0000	Median: 1.0000
Mean $:0.7747$	Mean $:0.2253$	Mean $:0.7262$
3rd Qu.:1.0000	3rd Qu.:0.0000	3rd Qu.:1.0000
Max. :1.0000	Max. :1.0000	Max. :1.0000

Table 9: Table continues below

HER2_status_measured_by_SNP6_GAIN	HER2_status_measured_by_SNP6_LOSS
Min. :0.0000	Min. :0.00000
1st Qu.:0.0000	1st Qu.:0.00000
Median: 0.0000	Median $:0.00000$
Mean $:0.2207$	Mean $:0.05128$
3rd Qu.:0.0000	3rd Qu.:0.00000
Max. $:1.0000$	Max. $:1.00000$

Table 10: Table continues below

HER2_status_measured_by_SNP6_UNDEF	HER2_Status_Positive
Min. :0.000000	Min. :0.0000
1st Qu.:0.000000	1st Qu.:0.0000
Median $:0.000000$	Median: 0.0000
Mean $:0.001832$	Mean $:0.1227$
3rd Qu.:0.000000	3rd Qu.:0.0000
Max. :1.000000	Max. $:1.0000$

Table 11: Table continues below

HER2_Status_Negative	$Tumor\_Other\_Histologic\_Subtype\_DN$
Min. :0.0000	Min. :0.000
1st Qu.:1.0000	1st Qu.:1.000
Median: 1.0000	Median: 1.000
Mean $:0.8773$	Mean $:0.761$
3rd Qu.:1.0000	3rd Qu.:1.000
Max. :1.0000	Max. :1.000

Table 12: Table continues below

${\bf Tumor\_Other\_Histologic\_Subtype\_Mixed}$	${\bf Tumor\_Other\_Histologic\_Subtype\_Lobular}$
Min. :0.0000	Min. :0.00000
1st Qu.:0.0000	1st Qu.:0.00000
Median: 0.0000	Median: 0.00000
Mean $:0.1264$	Mean $:0.07051$
3rd Qu.:0.0000	3rd Qu.:0.00000
Max. :1.0000	Max. :1.00000

Table 13: Table continues below

Tumor_Other_Histologic_Subtype_TC	Tumor_Other_Histologic_Subtype_Mucinous
Min. :0.00000	Min. :0.0000
1st Qu.:0.00000	1st Qu.:0.0000
Median $:0.00000$	Median: 0.0000
Mean $:0.01374$	Mean $:0.0119$
3rd Qu.:0.00000	3rd Qu.:0.0000
Max. $:1.00000$	Max. $:1.0000$

Table 14: Table continues below

${\tt Tumor\_Other\_Histologic\_Subtype\_Medullary}$
Min. :0.0000
1st Qu.:0.0000
Median: 0.0000
Mean :0.0119

Tumor_Other_Histologic_Subtype_Medullary
3rd Qu.:0.0000 Max. :1.0000
Max1.0000

Table 15: Table continues below

${\bf Tumor\_Other\_Histologic\_Subtype\_Other}$	Hormone_Therapy_No
Min. :0.000000	Min. :0.0000
1st Qu.:0.000000	1st Qu.:0.0000
Median $:0.000000$	Median: 0.0000
Mean $:0.004579$	Mean $:0.3864$
3rd Qu.:0.000000	3rd Qu.:1.0000
Max. :1.000000	Max. $:1.0000$

Table 16: Table continues below

Hormone_Therapy_Yes	$Inferred\_Menopausal\_State\_Pre$
Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000
Median: 1.0000	Median: 0.0000
Mean $: 0.6136$	Mean $:0.2299$
3rd Qu.:1.0000	3rd Qu.:0.0000
Max. :1.0000	Max. :1.0000

Table 17: Table continues below

$Inferred\_Menopausal\_State\_Post$	${\tt Primary\_Tumor\_Laterality\_Right}$
Min. :0.0000	Min. :0.0000
1st Qu.:1.0000	1st Qu.:0.0000
Median: 1.0000	Median: 0.0000
Mean $:0.7701$	Mean $:0.4817$
3rd Qu.:1.0000	3rd Qu.:1.0000
Max. :1.0000	Max. :1.0000

Table 18: Table continues below

${\bf Primary\_Tumor\_Laterality\_left}$	$Oncotree\_Code\_IDC$	$Oncotree\_Code\_MDLC$
Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:1.0000	1st Qu.:0.0000
Median: 1.0000	Median : 1.0000	Median: 0.0000
Mean $:0.5183$	Mean $:0.7866$	Mean $: 0.1264$
3rd Qu.:1.0000	3rd Qu.:1.0000	3rd Qu.:0.0000
Max. :1.0000	Max. :1.0000	Max. :1.0000

Table 19: Table continues below

Oncotree_Code_ILC	$Oncotree\_Code\_IMMC$	$Oncotree\_Code\_BREAST$
Min. :0.00000	Min. :0.0000	Min. :0.000000
1st Qu.:0.00000	1st Qu.:0.0000	1st Qu.:0.000000
Median $:0.00000$	Median: 0.0000	Median $:0.000000$
Mean $:0.07051$	Mean $:0.0119$	Mean $:0.004579$
3rd Qu.:0.00000	3rd Qu.:0.0000	3rd Qu.:0.000000
Max. $:1.00000$	Max. $:1.0000$	Max. $:1.000000$

Table 20: Table continues below

$Overall\_Survival\_Status\_0$	$Overall\_Survival\_Status\_1$	PR_Status_Positive
Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 1.0000	Median : 1.0000
Mean $:0.4432$	Mean $:0.5568$	Mean $:0.5229$
3rd Qu.:1.0000	3rd Qu.:1.0000	3rd Qu.:1.0000
Max. :1.0000	Max. :1.0000	Max. :1.0000

Table 21: Table continues below

PR_Status_Negative	Radio_Therapy_No	Radio_Therapy_Yes
Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 0.0000	Median : 1.0000
Mean $:0.4771$	Mean $:0.3361$	Mean $:0.6639$
3rd Qu.:1.0000	3rd Qu.:1.0000	3rd Qu.:1.0000
Max. :1.0000	Max. :1.0000	Max. $:1.0000$

Table 22: Table continues below

$Relapse\_Free\_Status\_0$	$Relapse\_Free\_Status\_1$	${\tt Gene\_classifier\_subtype\_ERH}$
Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.0000
Median : 1.0000	Median: 0.0000	Median: 0.0000
Mean $:0.5833$	Mean $:0.4167$	Mean $:0.3535$
3rd Qu.:1.0000	3rd Qu.:1.0000	3rd Qu.:1.0000
Max. $:1.0000$	Max. $:1.0000$	Max. $:1.0000$

Table 23: Table continues below

${\tt Gene\_classifier\_subtype\_ERL}$	${\tt Gene\_classifier\_subtype\_ERM}$
Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 0.0000
Mean $:0.3663$	Mean $:0.1694$

${\tt Gene\_classifier\_subtype\_ERL}$	${\tt Gene\_classifier\_subtype\_ERM}$
3rd Qu.:1.0000	3rd Qu.:0.0000
Max. :1.0000	Max. :1.0000

Table 24: Table continues below

${\tt Gene\_classifier\_subtype\_HER}$	$Patients\_Vital\_Status\_L$
Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 0.0000
Mean $:0.1108$	Mean $:0.4432$
3rd Qu.:0.0000	3rd Qu.:1.0000
Max. $:1.0000$	Max. $:1.0000$

Table 25: Table continues below

$Patients\_Vital\_Status\_D$	$Patients\_Vital\_Status\_DO$	$Integrative\_Cluster\_4p$
Min. :0.0000	Min. :0.0000	Min. :0.00
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.00
Median: 0.0000	Median: 0.0000	Median: 0.00
Mean $:0.3388$	Mean $:0.2179$	Mean $:0.13$
3rd Qu.:1.0000	3rd Qu.:0.0000	3rd Qu.:0.00
Max. :1.0000	Max. :1.0000	Max. :1.00

Table 26: Table continues below

Integrative_Cluster_9	$Integrative\_Cluster\_7$	Integrative_Cluster_3
Min. :0.0000	Min. :0.0000	Min. :0.0000
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.0000
Median: 0.0000	Median: 0.0000	Median: 0.0000
Mean $:0.0696$	Mean $:0.1007$	Mean $:0.1566$
3rd Qu.:0.0000	3rd Qu.:0.0000	3rd Qu.:0.0000
Max. :1.0000	Max. :1.0000	Max. :1.0000

Table 27: Table continues below

$Integrative\_Cluster\_10$	$Integrative\_Cluster\_8$	$Integrative\_Cluster\_6$
Min. :0.0000	Min. :0.0000	Min. :0.00000
1st Qu.:0.0000	1st Qu.:0.0000	1st Qu.:0.00000
Median: 0.0000	Median: 0.0000	Median $:0.00000$
Mean $:0.1126$	Mean $: 0.1346$	Mean $:0.04853$
3rd Qu.:0.0000	3rd Qu.:0.0000	3rd Qu.:0.00000
Max. :1.0000	Max. $:1.0000$	Max. :1.00000

Table 28: Table continues below

Integrative_Cluster_1	$Integrative\_Cluster\_2$	Integrative_Cluster_5
Min. :0.00000	Min. :0.00000	Min. :0.00000
1st Qu.:0.00000	1st Qu.:0.00000	1st Qu.:0.00000
Median $:0.00000$	Median $:0.00000$	Median $:0.00000$
Mean $:0.07051$	Mean $:0.04212$	Mean $: 0.09799$
3rd Qu.:0.00000	3rd Qu.:0.00000	3rd Qu.:0.00000
Max. $:1.00000$	Max. $:1.00000$	Max. :1.00000

Table 29: Table continues below

Integrative_Cluster_4m	$Cancer\_Type\_Detailed$	Age_at_Diagnosis
Min. :0.00000	Length:1092	Min. :21.93
1st Qu.:0.00000	Class :character	1st Qu.:50.79
Median $:0.00000$	Mode :character	Median: $60.99$
Mean $: 0.03663$	NA	Mean $:60.39$
3rd Qu.:0.00000	NA	3rd Qu.:69.70
Max. :1.00000	NA	Max. :96.29

Table 30: Table continues below

Neo_Grade	Lymph	Mutation	Nottingham
Min. :1.000	Min.: 0.000	Min.: 1.000	Min. :2.002
1st Qu.:2.000	1st Qu.: 0.000	1st Qu.: 3.000	1st Qu.: 3.052
Median : 3.000	Median: 0.000	Median: 5.000	Median $:4.046$
Mean $:2.446$	Mean: $1.889$	Mean: $5.484$	Mean $:4.129$
3rd Qu.:3.000	3rd Qu.: 2.000	3rd Qu.: 7.000	3rd Qu.:5.046
Max. $:3.000$	Max. :41.000	Max. :46.000	Max. :6.360

Overall_Month	Relapse_Month	TMB	Tumor_Size	Tumor_Stage
Min.: 0.10	Min.: 0.00	Min.: 1.308	Min.: 1.00	Min. :1.000
1st Qu.: 60.83	1st Qu.: 40.88	1st Qu.: 3.923	1st Qu.: 17.00	1st Qu.:1.000
Median: 116.98	Median: 99.82	Median: 6.538	Median: 22.00	Median $:2.000$
Mean $:126.55$	Mean :111.23	Mean: $7.153$	Mean: 26.03	Mean $:1.759$
3rd Qu.:188.43	3rd Qu.:173.43	3rd Qu.: 9.153	3rd Qu.: 30.00	3rd Qu.:2.000
Max. $:337.03$	Max. $:298.88$	Max. :60.146	Max. $:180.00$	Max. $:4.000$