

2.Gene_expression

Fay

2022-05-27

Libraries:

```
library(tidyverse)

## -- Attaching packages ----- tidyverse 1.3.1 --
## v ggplot2 3.3.6      v purrr  0.3.4
## v tibble  3.1.7      v dplyr  1.0.9
## v tidyr   1.2.0      v stringr 1.4.0
## v readr   2.1.2      v forcats 0.5.1

## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()     masks stats::lag()

library(tidyr)
library(dplyr)
library(cowplot)
library(randomForest)

## randomForest 4.7-1
## Type rfNews() to see new features/changes/bug fixes.
##
## Attaching package: 'randomForest'
##
## The following object is masked from 'package:dplyr':
##
##     combine
##
## The following object is masked from 'package:ggplot2':
##
##     margin

library(ggplot2)
library(caret)

## Loading required package: lattice
##
## Attaching package: 'caret'
##
## The following object is masked from 'package:purrr':
##
##     lift
```

```
g <- read.csv("output_data/gene_expression/data_products/clean_gene_expression.csv")

# vectors for selecting gene columns
Genes <- c("IFNy", "CXCR3_bio", "IL.6", "IL.10", "IL.13", "IL.10", "IL.13", "IL1RN",
           "CASP1", "CXCL9", "IDO1", "IRGM1", "MPO", "MUC2", "MUC5AC", "MYD88",
           "NCR1", "PRF1", "RETNLB", "SOCS1", "TICAM1", "TNF")
```

Import the data:

```
g$Parasite_challenge <- as.factor(g$Parasite_challenge)
g$Eim_MC <- as.factor(g$Eim_MC)
```

Data cleaning

```
g <- g %>%
  dplyr::mutate(Infection = case_when(
    Parasite_challenge == "E_ferrisi" & Eim_MC == "TRUE" ~ "E_ferrisi",
    Parasite_challenge == "E_ferrisi" & Eim_MC == "FALSE" ~ "uninfected",
    Parasite_challenge == "E_falciiformis" & Eim_MC == "TRUE" ~ "E_falciiformis",
    Parasite_challenge == "E_falciiformis" & Eim_MC == "FALSE" ~ "uninfected",
    Parasite_challenge == "uninfected" & Eim_MC == "TRUE" ~ "infected_eimeria",
    Parasite_challenge == "uninfected" & Eim_MC == "FALSE" ~ "uninfected",
    TRUE ~ ""
  ))

# how to impute delta? Replacing with 0 the ones with negative melting curve
g <- g %>%
  dplyr::mutate(Intensity = case_when(
    Eim_MC == "TRUE" ~ delta,
    Eim_MC == "FALSE" ~ 0))

g.1 <- g %>%
  dplyr::select(c(max_WL, all_of(Genes)))

# to get reproducible results we use a seed
set.seed(42)

# We want the maximum weight loss to be predicted by the data in all of the other columns

# iter = how many random forests are needed, in theory 6 are enough
g.imputed <- rfImpute(max_WL ~ ., data = g.1, iter = 6)
```

Imputing missing data + cleaning

```
##      |      Out-of-bag      |
## Tree |      MSE %Var(y)      |
## 300  |      26.48  62.00      |
##      |      Out-of-bag      |
## Tree |      MSE %Var(y)      |
## 300  |      27.85  65.22      |
```

```
##      |      Out-of-bag |
## Tree |      MSE %Var(y) |
## 300 |      27.93   65.39 |
##      |      Out-of-bag |
## Tree |      MSE %Var(y) |
## 300 |      27.44   64.24 |
##      |      Out-of-bag |
## Tree |      MSE %Var(y) |
## 300 |      28.47   66.65 |
##      |      Out-of-bag |
## Tree |      MSE %Var(y) |
## 300 |      28.63   67.03 |
```

```
g.imputed <- g.imputed %>% dplyr::select(-max_WL)
```

```
g <- g %>%
  dplyr::select(-all_of(Genes))
```

```
#full data set containing the imputed gene expression data
g.imputed <- cbind(g, g.imputed)
```

How many mice are in the infection planning?

```
g.imputed %>%
  filter(infection == "challenge") %>%
  group_by(Parasite_challenge) %>%
  summarize(length(EH_ID))
```

```
## # A tibble: 3 x 2
##   Parasite_challenge `length(EH_ID)`
##   <fct>              <int>
## 1 E_falciformis      22
## 2 E_ferrisi          47
## 3 uninfected         47
```

How many mice are indeed infected?

```
g.imputed %>%
  filter(infection == "challenge") %>%
  group_by(Infection) %>%
  summarize(length(EH_ID))
```

```
## # A tibble: 4 x 2
##   Infection      `length(EH_ID)`
##   <chr>          <int>
## 1 E_falciformis    22
## 2 E_ferrisi       39
## 3 infected_eimeria  9
## 4 uninfected      46
```

I guess mice got mixed up here?

Splitting data into training and testing sets Splitting between training and testing: - Assess model performance on unseen data - Avoid over-fitting

```
#select the relevant columns:
g.imputed <- g.imputed %>%
```

```

dplyr::select(c(max_WL, Infection, Intensity, all_of(Genes)))

# split data into training and test

set.seed(123) # this will help us reproduce this random assignment

# in this way we can pick the random numbers

training.samples <- g.imputed$max_WL%>%
  createDataPartition(p = .7, # this is the partition! In this case 0.7 = training data and 0.3 = test data
    list = FALSE) # we don't want to get a list in return

train.data <- g.imputed[training.samples, ] #include all the randomly selected rows
test.data <- g.imputed[-training.samples, ]

#train the model
model <- randomForest(max_WL ~., data = train.data, proximity = TRUE)

```

Building the model

```

predictions <- predict(model, test.data)

result <- test.data
result['prediction'] <- predictions

#add the results to a data frame containing test data and the prediction
result <- cbind(g[row.names(result), ], result$prediction)

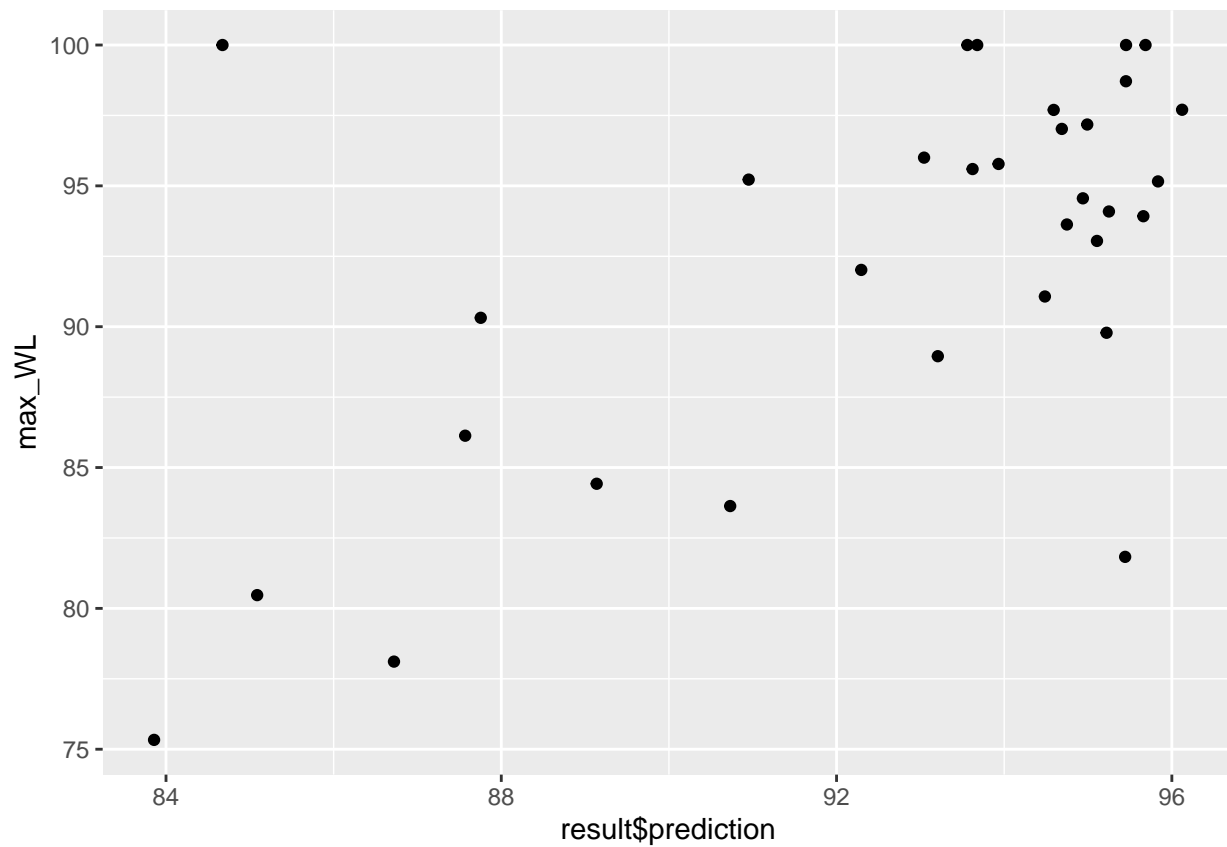
```

Making predictions

```

result %>%
  ggplot() +
  geom_point(aes(x = `result$prediction`, y = max_WL))

```



Visualizations

```
plot(y =result$max_WL, x = result$`result$prediction`,
      # Draw plot using Base R
      xlab = "Predicted Values",
      ylab = "Observed Values",
      abline(a = 0,
              b = 1,
              col = "red",
              lwd = 2))
```

Add straight line

