MWAS code structure:

```
mwas_analysis.r -- command line function, includes "train",
"predict", "plot", "statistics" options.
Dependencies (required packages):
1. optparse - option parsing
            biom format file operation
2. biom
3. e1071

    classifier package (SVM, cross-validation...)

4. randomForest - random forest
5. glmnet - for multi-normial regression
6. pR0C
            ROC analysis
7. caret
8. xlsx

    variable importance analysis for feature selection

    for Excel workbook output

9. beeswarm - beeswarm plot
# 10. kernlab - future version will add this function
Input Option list
Training:
Rscript mwas_analysis.r -w train
          otu fp
     -i
          map fp
     -m
          category
     -c
     -0
          out dir
          classifier method
     -t
           classifier_parameter
     -k
          validation type
     -е
     -f
          number of fold cv
     -s
          is_feature_selection
     -b
           feature_selection_paramter
Rscript bin/mwas analysis.R -w train -i
test/data/GG 100nt even10k-adults-s20.biom -m test/data/gg-
map-adults.txt -c COUNTRY -o example/train out/ -t svm
Predicting:
Rscript mwas_analysis.r -w predict
    -i
           otu fp
    -m
           map fp (optional)
    -c
          category (optional)
           out dir
    -0
    -k
           trained_model_fp
Rscript bin/mwas analysis.R -w predict -i
test/data/GG_100nt_even10k-adults-s20.biom -m test/data/qq-
```

map-adults.txt -c COUNTRY -o example/predict out/ -k

example/train out/trained model.rds

```
Plot: (all capital for plot-only parameters)
Rscript mwas_analysis.r -w plot
    -i
          otu_fp
    -0
          out_dir
    -V
          plot_type
    -F
          feat_fp
    −D
          distance_fp
    −P
          pcoa fp
    −W
          which taxa
    -S
          shorten_taxa
    -M
          multiple_axis
    -N
          nplot
    -T
          transform_type
    -X
          x_axis_label
    -C
          suppress relative abundance conversion
   -R
          sort_by_abundance
    -A
          Maximum false discovery rate (alpha)
   -0
          category_order
Rscript bin/mwas analysis.R -w plot -V gradients -i
test/data/GG 100nt even10k-adults-s20.biom -W
'Bacteroides, Prevotella' -o example/plot_out_gradient
Rscript bin/mwas analysis.R -w plot -V diff -i
test/data/GG 100nt even10k-adults-s20.biom -W
'Bacteroides, Prevotella' -o example/plot ou diff
Statistics:
Rscript mwas_analysis.r -w statistics
    -i
          otu_fp
    -m
          map_fp
```

category

out dir

-с -о

Function list

| File name | Function names | Notes |
|--------------------|-------------------------------|-----------|
| import_data.R | import.train.params | |
| | import.predict.params | |
| | import.plot.params | |
| | import.stats.params | |
| util.load.R | read.qiime.table.mwas | |
| | read.qiime.classic.table | |
| | load.qiime.mapping.file | |
| | load.qiime.otu.table | |
| | otu.table.has.metadata | |
| | get.header.index | |
| | load.qiime.taxon.table | |
| | load.qiime.distance.matrix | |
| | load.qiime.pcoa.file | |
| | load.qiime.feature.stats | |
| | remove.nonoverlapping.samples | |
| | load.experiment | |
| | cluster.by.correlation | |
| | collapse.by.correlation | |
| | inspect.env | |
| | shorten.taxonomy | |
| | balanced.folds | |
| | is.outlier | |
| | factor.to.numeric | |
| | parse.params | not used |
| model.train.R | train.mwas | |
| | persist.model.mwas | |
| | cross.validation.mwas | |
| model.evaluation.R | model.evaluation.mwas | |
| | predict.knn | S3 method |
| preprocess_mwas.R | preprocess.mwas | |
| | filter.pathways | |
| | get.next.kegg | |
| visualization.R | plot.mwas | |
| | plot.differentiated.taxa | |
| | plot.beeswarm.dt | |
| | run.scatterplot | not used |
| | run.scatterplot.all.data | not used |
| | run.beeswarm | not used |
| | plot.gradients | |
| | qqplot.pvals | not used |

| export_data.R | export.mwas | |
|----------------------|------------------------------------|--------------------------------------------------|
| | save.xlsx | |
| | write.differentiation.test.results | |
| stats.r | differentiation.test | |
| | linear.test | not used |
| | t.test.wrapper | not used |
| roc_mwas.R | roc.mwas | |
| gradients.R | show.gradients | |
| | show.metadata | |
| | get.gradient.ixs | |
| | best.legend.location | |
| features.selection.R | feature.scores.rf.mwas | |
| heatmap.3.R | heatmap.3 | |
| heatmap.mwas.R | cluster.columns | |
| | cluster.rows | |
| | shorten.taxonomy | Similar to the one in util.load.R; commented out |
| | create.color.bars | commence out |
| | heatmap.mwas | |