TRM_genes_arrays

October 11, 2019

0.1 TRM_genes_arrays

Importing files and produced a join file with ['GeneSymbol', 'mRNA_Accession', 'adj.P.Val', 'logFC'] information per file

0.1.1 Notes

- Per file: We are going to have one unique row per GeneSymbol, mean for numeric and NM_for mRNA_Accession. We do not want EMSM (Ensamble).
- We are going to do an inner/outer join

0.2 Importing packages

```
import re # Regular Expressions
from six.moves import reduce # Merge dataframes

## Setting the seed value for reproducibility

seed_value= 123# Set a seed value

# Set `python` built-in pseudo-random generator at a fixed value import random
random.seed(seed_value)

# Set `numpy` pseudo-random generator at a fixed value import numpy as np
np.random.seed(seed_value)

seed = np.random.RandomState(123)
# do not call numpy.random.rand() but seed.rand()

# 3. Set environment
os.urandom(seed_value)
```

0.3 Defining Functions

• Defining function to be used in this script

0.3.1 Importing datasets

```
Converting the files into dataframes and saving them as
           a list of dataframes.
           and adding the file name at the end of every selected column name
           # Getting a list of filenames
           all_files = [x for x in os.listdir() if x.endswith(".txt")]
           print('List of files:')
          print(all_files)
          print('---- \n')
           # Converting the files into dataframes and saving them as
           # a list of dataframes.
           list_of_datasets = [pd.read_csv(filename, delimiter="\t",
                                        usecols= columns_to_keep
                                       ).add_suffix('_' + filename)
                         for filename in all_files]
           #Verifying data type
           print('data type per file:')
           for file in list_of_datasets:
              print( file.dtypes)
              print('----')
           # print(list_of_dfs[0])
           return list_of_datasets
       def dataset_size(list_of_datasets):
           for file in list_of_datasets:
              print('File name: ' + str(file.columns[0][11:]) +
                    ', ', 'Total Observations: ' + str(file.size/4))
           print('----')
           ## Initial Total size of observations in the list of datasets:
           print('Total size of observations in the list of datasets: given as '
                +' (observations, columns)')
           print(pd.concat(list_of_datasets, sort=False).shape )
           print('---- \n ')
0.3.2 Cleaning files
In [4]: #-----
       # Cleaning files
       #----
       def GeneSymbol_remove_multiple_values(column):
           ''' Selecting one GeneSymbol when more than one is provided by
           record and the separator is: ///
```

input Files are saved as '.txt'

```
Input example: Srp54c///Srp54b///Srp54a
        Rule: select a GeneSymbol that do not contain LOC, GM, #RIK
#
      if re.findall("[///]", column):
    if '///' in column:
        column = str(column)
        GeneSymbol_list = re.split(r'///', column)
        patterns = ['LOC', 'GM', '#RIK']
        omit = \Pi
        result = []
        for i in GeneSymbol_list:
            if re.search(r"LOC", i ): omit.append(i)
            elif re.search(r"GM", i ): omit.append(i)
        result = sorted(list(set(GeneSymbol_list) - set(omit)))
        if result == []: record = GeneSymbol_list[0]
        else: record = result[0]
    else:
        record = column
    return record
# str1 = 'LOC///LOC'
# print(GeneSymbol remove multiple values3(str1))
def cleaning_dataframe(df):
    input/output file is a dataframe'''
    for column in df.columns:
          if column in ['GeneSymbol', 'mRNA_Accession']:
        if re.search('^GeneSymbol|^mRNA_Accession', column):
            #print (column)
            # Remove dupplicate string in observation per column.
            # Example: Srp54c///Srp54b///Srp54a///
            df[column] = df[column].astype(str).apply(
                GeneSymbol_remove_multiple_values)
            # Remove dupplicate string in observation per column.
            # Example: Emp1 // Emp1
            df[column] = df[column].str.split(" //", expand=True)[0]
            # remove white space
            df[column] = df[column].str.strip()
            # Replace '---' & 'O' with NaN
            df[column].replace('---',np.nan, inplace=True)
            df[column].replace('0',np.nan, inplace=True)
            df[column].replace('',np.nan, inplace=True)
```

```
df[column].replace('nan',np.nan, inplace=True)
return df
```

0.3.3 Identifying Missing values

```
# Identifying Missing values
       #-----
       def percentage_missing_values(list_of_datasets):
           Identifying percentage of missing values given a list of dataframes
           for file in list_of_datasets:
              print ( round(file.isna().sum() *100 / (file.size/4) ,2) )
              print('----')
       #Removing missing values for the GeneSymbol columns.
       def drop missing values(list of datasets):
           If there are missing values on the GeneSymbol, then we drop the row.
           Otherwise we keep the row.
           for file in list_of_datasets:
              file.dropna(subset = [file.filter(regex='^GeneSymbol',
                                              axis=1).columns[0]], inplace=True)
            file.dropna(inplace=True)
          return list_of_datasets
       # Imputing missing values
       def impute_missing_values(list_of_datasets):
           If there are missing values on the numeric fields, then impute with the mean.
           If there are missing values on the categorical fields, then impute with the mode.
           for file in list_of_datasets:
              GeneSymbol_col = file.filter(regex='^GeneSymbol',axis=1).columns[0]
              mRNA_col = file.filter(regex='^mRNA_Accession',axis=1).columns[0]
              adj_P_Val_col = file.filter(regex='^adj.P.Val',axis=1).columns[0]
              logFC_col = file.filter(regex='^logFC',axis=1).columns[0]
              file[mRNA_col] = file.groupby(GeneSymbol_col)[mRNA_col].transform(
                  lambda x: x.fillna(x.mode().get(0,'NaN/#N/A')))
              file[adj_P_Val_col] = file.groupby(GeneSymbol_col)[adj_P_Val_col].transform(
```

```
lambda x: x.fillna(x.mean()))
             file[logFC_col] = file.groupby(GeneSymbol_col)[logFC_col].transform(
                 lambda x: x.fillna(x.mean()))
          return list of datasets
0.3.4 Removing Duplicate Records
In [6]: #-----
       # Removing duplicate records (Duplicate rows having the same GeneSymbol)
       #-----
      ## Removing duplicate records (rows)
      def duplicate_rows_one_column (data):
          Remove duplicate rows having the same GeneSymbol
          Calculate mean for numeric columns
          Maintain mRNA_Accession NM
          input/output file is a dataframe
          df_duplicate_rows = data.groupby([data.filter(regex='^GeneSymbol',
                                                 axis=1).columns[0]],
                                      as_index=False).aggregate(
             {data.filter(regex='^mRNA_Accession',axis=1).columns[0]: 'max',
              data.filter(regex='^adj.P.Val',axis=1).columns[0]: 'mean',
              data.filter(regex='^logFC',axis=1).columns[0]: 'mean'})
          return df_duplicate_rows
       # data.filter(reqex='^mRNA Accession',axis=1).columns[0]: pd.Series.mode,
0.3.5 Merging Multiple dataframes
# Joinining Dataframes
       ## Merging the files using merge and reduce function and after
      # compiling the list of dataframes to merge.
      # To keep the values that belong to the same gene symbol we need
      # to merge it on the GeneSymbol.
       # We are doing an outer join (NAs will be added)
      def merging_list_of_datasets(list_of_datasets, join_type = 'outer'):
          df_merged = reduce(lambda left, right:
```

pd.merge(left, right,

left on = left.filter(

```
regex='^GeneSymbol',axis=1).columns[0] ,
                                    right_on= right.filter(
                                        regex='^GeneSymbol',axis=1).columns[0],
                                    how = join_type),
                            list of datasets)
          return df_merged
       #If column multi indexes
       #(it was injecting the 'on' as a column which worked for the first merge,
       # but subsequent merges failed),
       #instead I got it to work with:
       #df = reduce(lambda left, right: left.join(right, how='outer', on='Date'), dfs)
0.3.6 Retriving Files
In [8]: #----
       # Retriving Files
       def output_file(output_file, output_path, output_file_name):
          Retrive a single file,
           inputs output file: dataframe,
           output_path: folder location,
           output_file_name: file name with .txt extension
           output_file.to_csv(os.path.join(output_path, output_file_name), sep='\t')
       def output_list_of_datasets(output_list_of_datasets, output_path,
                                 output_file_name):
           ,,,
           Retrive a list_of_datasets,
           inputs output_file: list_of_datasets,
           output path: folder location,
           output\_file\_name: file name with .txt extension
          pd.concat(output_list_of_datasets, sort=True).to_csv(
              os.path.join(output_path, output_file_name), sep='\t')
```

In []:

0.4 Runing Main Functions

- User input information manually
- Computation and outputs generated

```
# User input:
       #-----
       #path = input("Enter the folder location of the dataset files:")
      path = '/TRM_GeneArrays/input_files'
       #columns_to_keep = input("Enter the name of the columns to keep for GPL file:")
      columns_keep = ['GeneSymbol', 'mRNA_Accession', 'adj.P.Val', 'logFC']
       #output_path = input('Enter the location to store the output file:')
      output_path = '/TRM_GeneArrays/output_files'
# Computation Importing datasets
       #-----
       # setting working directory:
       path = set_directory(path)
       # Converting files into dataframes
       list_of_dfs = list_of_datasets(path, columns_keep)
       # Original datasets sizes
       print('\nOriginal dataset size: ')
       dataset_size(list_of_dfs)
List of files:
['GSM2386506_Kupper.txt', 'GSE47045_GE02R_TRM_v_TN_Carbone.txt', 'GSE79858_Slansky_TIL_v_TN.tx'
_____
data type per file:
GeneSymbol_GSM2386506_Kupper.txt
                                  object
adj.P.Val_GSM2386506_Kupper.txt
                                  float64
                                  float64
logFC_GSM2386506_Kupper.txt
mRNA_Accession_GSM2386506_Kupper.txt
                                   object
dtype: object
GeneSymbol_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                               object
mRNA_Accession_GSE47045_GEO2R_TRM_v_TN_Carbone.txt
                                               object
adj.P.Val_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                              float64
logFC_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                              float64
dtype: object
GeneSymbol_GSE79858_Slansky_TIL_v_TN.txt
                                          object
mRNA_Accession_GSE79858_Slansky_TIL_v_TN.txt
                                          object
adj.P.Val_GSE79858_Slansky_TIL_v_TN.txt
                                         float64
logFC_GSE79858_Slansky_TIL_v_TN.txt
                                         float64
```

```
dtype: object
GeneSymbol_GSE_Anderson_TIL_v_Naive.txt
                                        object
mRNA_Accession_GSE_Anderson_TIL_v_Naive.txt
                                        object
adj.P.Val_GSE_Anderson_TIL_v_Naive.txt
                                       float64
logFC_GSE_Anderson_TIL_v_Naive.txt
                                       float64
dtype: object
Original dataset size:
File name: GSM2386506_Kupper.txt, Total Observations: 41345.0
File name: GSE47045_GE02R_TRM_v_TN_Carbone.txt, Total Observations: 34761.0
File name: GSE79858_Slansky_TIL_v_TN.txt, Total Observations: 35557.0
File name: GSE_Anderson_TIL_v_Naive.txt, Total Observations: 45101.0
Total size of observations in the list of datasets: given as (observations, columns)
(156764, 16)
# Computation Cleaning datasets
       #-----
       print('Checking values before cleaning: ')
       print(list_of_dfs[1]['GeneSymbol_GSE47045_GE02R_TRM_v_TN_Carbone.txt'][34732])
       for file in list_of_dfs:
           cleaning_dataframe(file)
       print('\nChecking values after cleaning: ')
       print(list_of_dfs[1]['GeneSymbol_GSE47045_GE02R_TRM_v_TN_Carbone.txt'][34732])
       print('----')
Checking values before cleaning:
Vmn2r51///Vmn2r36///Vmn2r34///Vmn2r28///Vmn2r48///Vmn2r35///Vmn2r33///Vmn2r43///Vmn2r29///Vmn2r39//
Checking values after cleaning:
Vmn2r28
# Computation Identifying Missing values
       #-----
       ## Percentage of missing values
       print('\nPercentage of missing values: ')
```

```
percentage_missing_values(list_of_dfs)
         # Let's figure out which values are missing!
         print('\nExample of missing values for GeneSymbol_GSM2386506_Kupper: ')
         print( list_of_dfs[0][ list_of_dfs[0]['GeneSymbol_GSM2386506_Kupper.txt'].isnull()
                              ].head(3) )
         print('----')
         # Removing missing values for the GeneSymbol columns.
         drop_missing_values(list_of_dfs)
         list_of_dfs = impute_missing_values(list_of_dfs)
         ## Checking the new Percentage of missing values
         print('\nNew percentage of missing values: ')
         percentage_missing_values(list_of_dfs)
         # Datasets size after removing missing values:
         print('\nDatasets size after removing missing values: ')
         dataset_size(list_of_dfs)
         # Saving the list of datasets after the cleaning step
         file_name_cleaned = 'cleaned_files.txt'
         output_list_of_datasets(list_of_dfs, output_path, file_name_cleaned)
Percentage of missing values:
GeneSymbol_GSM2386506_Kupper.txt
                                        35.45
adj.P.Val_GSM2386506_Kupper.txt
                                         0.00
logFC_GSM2386506_Kupper.txt
                                         0.00
mRNA_Accession_GSM2386506_Kupper.txt
                                        18.61
dtype: float64
_____
GeneSymbol_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                      29.67
mRNA_Accession_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                      23.16
adj.P.Val_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                       0.00
logFC_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                       0.00
dtype: float64
GeneSymbol_GSE79858_Slansky_TIL_v_TN.txt
                                                29.63
mRNA_Accession_GSE79858_Slansky_TIL_v_TN.txt
                                                18.45
adj.P.Val_GSE79858_Slansky_TIL_v_TN.txt
                                                 0.00
logFC_GSE79858_Slansky_TIL_v_TN.txt
                                                 0.00
dtype: float64
GeneSymbol_GSE_Anderson_TIL_v_Naive.txt
                                               11.62
mRNA_Accession_GSE_Anderson_TIL_v_Naive.txt
                                                0.14
adj.P.Val_GSE_Anderson_TIL_v_Naive.txt
                                                0.00
```

```
logFC_GSE_Anderson_TIL_v_Naive.txt
                                                 0.00
dtype: float64
Example of missing values for GeneSymbol GSM2386506 Kupper:
  GeneSymbol_GSM2386506_Kupper.txt
                                    adj.P.Val_GSM2386506_Kupper.txt
16
                                                               0.0421
35
                                NaN
                                                               0.0421
36
                                NaN
                                                               0.0421
    logFC_GSM2386506_Kupper.txt mRNA_Accession_GSM2386506_Kupper.txt
                                                  ENSMUST00000102339
16
                      -3.759582
35
                       3.472884
                                                                  NaN
36
                      -3.747909
                                                                  NaN
_____
New percentage of missing values:
GeneSymbol_GSM2386506_Kupper.txt
                                        0.0
adj.P.Val_GSM2386506_Kupper.txt
                                        0.0
logFC GSM2386506 Kupper.txt
                                        0.0
mRNA_Accession_GSM2386506_Kupper.txt
                                        0.0
dtype: float64
                                                       0.0
GeneSymbol_GSE47045_GE02R_TRM_v_TN_Carbone.txt
mRNA_Accession_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                       0.0
adj.P.Val_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                       0.0
logFC_GSE47045_GE02R_TRM_v_TN_Carbone.txt
                                                       0.0
dtype: float64
GeneSymbol_GSE79858_Slansky_TIL_v_TN.txt
                                                 0.0
mRNA_Accession_GSE79858_Slansky_TIL_v_TN.txt
                                                 0.0
adj.P.Val_GSE79858_Slansky_TIL_v_TN.txt
                                                 0.0
logFC_GSE79858_Slansky_TIL_v_TN.txt
                                                 0.0
dtype: float64
GeneSymbol_GSE_Anderson_TIL_v_Naive.txt
                                               0.0
mRNA Accession GSE Anderson TIL v Naive.txt
                                               0.0
adj.P.Val_GSE_Anderson_TIL_v_Naive.txt
                                               0.0
logFC_GSE_Anderson_TIL_v_Naive.txt
                                               0.0
dtype: float64
Datasets size after removing missing values:
File name: GSM2386506 Kupper.txt, Total Observations: 26688.0
File name: GSE47045_GE02R_TRM_v_TN_Carbone.txt, Total Observations: 24447.0
File name: GSE79858_Slansky_TIL_v_TN.txt, Total Observations: 25023.0
File name: GSE_Anderson_TIL_v_Naive.txt, Total Observations: 39860.0
_____
```

```
Total size of observations in the list of datasets: given as (observations, columns)
(116018, 16)
In [13]: # Checking unique values per GeneSymbol before running the function.
        for file in list_of_dfs:
             print (file[file.filter(regex='^GeneSymbol',axis=1).columns[0]
        # ].astype(object).nunique() )
           print( file[file.filter(regex='^GeneSymbol',axis=1).columns[0]
                      ].astype(object).describe() )
         26688
count
unique
         24389
         Syne1
top
freq
           59
Name: GeneSymbol_GSM2386506_Kupper.txt, dtype: object
         24447
count
         21637
unique
top
         Hmcn1
           77
Name: GeneSymbol_GSE47045_GEO2R_TRM_v_TN_Carbone.txt, dtype: object
           25023
count
           21639
unique
         Snord115
top
              79
Name: GeneSymbol_GSE79858_Slansky_TIL_v_TN.txt, dtype: object
            39860
count
unique
            21415
         Igh-VJ558
top
freq
               17
Name: GeneSymbol_GSE_Anderson_TIL_v_Naive.txt, dtype: object
# Computation Removing duplicate records
        #-----
        ## creating a new list of dataframes after removing duplicate records
        new_list_of_dfs = []
        for file in list_of_dfs:
           new_list_of_dfs.append(duplicate_rows_one_column(file))
        # Datasets size after removing duplicates in GeneSymbol
        print('\nDatasets size after removing duplicates in GeneSymbol: ')
```

```
dataset_size(new_list_of_dfs)
        # Saving the list of datasets after removing duplicates
        file_name_duplicates= 'removed_duplicates_files.txt'
        output list of datasets(new list of dfs, output path, file name duplicates)
Datasets size after removing duplicates in GeneSymbol:
File name: GSM2386506_Kupper.txt, Total Observations: 24389.0
File name: GSE47045_GE02R_TRM_v_TN_Carbone.txt, Total Observations: 21637.0
File name: GSE79858_Slansky_TIL_v_TN.txt, Total Observations: 21639.0
File name: GSE_Anderson_TIL_v_Naive.txt, Total Observations: 21415.0
Total size of observations in the list of datasets: given as (observations, columns)
(89080, 16)
_____
In [15]: #-----
        # Computation Merging multiple dataframes
        #-----
        df_merged_outer = merging_list_of_datasets(new_list_of_dfs, join_type = 'outer')
        print('\nMerged dataframe with outer join')
        print('Total size of observations in the outer dataframe given as'
              +' (observations, columns): ')
        print(df_merged_outer.shape)
        display(df_merged_outer.head(3))
        print('----')
        df_merged_inner = merging_list_of_datasets(new_list_of_dfs, join_type = 'inner')
        print('\nMerged dataframe with inner join')
        print('Total size of observations in the inner dataframe given as'
              +' (observations, columns): ')
        print(df_merged_inner.shape)
        display(df_merged_inner.head(3))
Merged dataframe with outer join
Total size of observations in the outer dataframe given as (observations, columns):
(33610, 16)
 GeneSymbol GSM2386506 Kupper.txt mRNA Accession GSM2386506 Kupper.txt \
0
                   0610005C13Rik
                                                          NR 038166
1
                   0610007C21Rik
                                                          NM 027855
2
                   0610007L01Rik
                                                          NM_027854
```

```
adj.P.Val_GSM2386506_Kupper.txt logFC_GSM2386506_Kupper.txt
0
                              0.8534
                                                          -0.120814
                              0.6331
                                                           0.290360
1
2
                              0.9048
                                                           0.119549
  GeneSymbol_GSE47045_GE02R_TRM_v_TN_Carbone.txt
0
1
                                                NaN
2
                                                NaN
  {\tt mRNA\_Accession\_GSE47045\_GE02R\_TRM\_v\_TN\_Carbone.txt}
0
                                                    NaN
                                                    NaN
1
2
                                                    NaN
   adj.P.Val_GSE47045_GE02R_TRM_v_TN_Carbone.txt
0
                                                NaN
                                                NaN
1
2
                                                NaN
   logFC_GSE47045_GE02R_TRM_v_TN_Carbone.txt
0
                                            NaN
1
                                            NaN
2
                                            NaN
  GeneSymbol_GSE79858_Slansky_TIL_v_TN.txt
0
                                          NaN
1
                                          NaN
2
                                          NaN
  mRNA_Accession_GSE79858_Slansky_TIL_v_TN.txt
0
                                              NaN
1
                                              NaN
2
                                              NaN
   adj.P.Val_GSE79858_Slansky_TIL_v_TN.txt
0
                                          NaN
1
                                          NaN
2
                                         NaN
   logFC_GSE79858_Slansky_TIL_v_TN.txt
0
                                     NaN
1
                                     NaN
2
                                     NaN
  GeneSymbol_GSE_Anderson_TIL_v_Naive.txt
0
                              0610005C13Rik
1
                                        NaN
```

2 NaN ${\tt mRNA_Accession_GSE_Anderson_TIL_v_Naive.txt}$ 0 NR_038165 1 NaN2 NaN adj.P.Val_GSE_Anderson_TIL_v_Naive.txt logFC_GSE_Anderson_TIL_v_Naive.txt 0 0.792 -0.06301 NaN NaN 1 2 NaN NaN -----Merged dataframe with inner join Total size of observations in the inner dataframe given as (observations, columns): (16101, 16)GeneSymbol GSM2386506 Kupper.txt mRNA Accession GSM2386506 Kupper.txt 0 0610007P14Rik NM_021446 1 0610009B22Rik BC024353 2 0610009L18Rik NR_038126 adj.P.Val_GSM2386506_Kupper.txt logFC_GSM2386506_Kupper.txt 0 0.9545 -0.089542 1 0.9759 0.082806 2 0.8914 0.155382 ${\tt GeneSymbol_GSE47045_GEO2R_TRM_v_TN_Carbone.txt}$ 0 0610007P14Rik 1 0610009B22Rik 2 0610009L18Rik mRNA_Accession_GSE47045_GE02R_TRM_v_TN_Carbone.txt 0 NM_021446 NM_025319 1 2 NR_038126 adj.P.Val_GSE47045_GE02R_TRM_v_TN_Carbone.txt 0 0.430283 0.680325 1 2 0.983132 logFC_GSE47045_GE02R_TRM_v_TN_Carbone.txt 0 -1.062394

0.423292

1

2 -0.023245

```
GeneSymbol_GSE79858_Slansky_TIL_v_TN.txt
                             0610007P14Rik
                              0610009B22Rik
1
2
                             0610009L18Rik
  mRNA_Accession_GSE79858_Slansky_TIL_v_TN.txt \
0
                                      NM 021446
                                      NM_025319
1
2
                                      NR_038126
   adj.P.Val_GSE79858_Slansky_TIL_v_TN.txt
0
                                   0.029688
                                   0.002676
1
2
                                   0.097500
   logFC_GSE79858_Slansky_TIL_v_TN.txt \
0
                                  0.973
1
                                  1.430
2
                                 -0.363
  GeneSymbol_GSE_Anderson_TIL_v_Naive.txt \
0
                            0610007P14Rik
1
                            0610009B22Rik
2
                            0610009L18Rik
  mRNA_Accession_GSE_Anderson_TIL_v_Naive.txt
0
                                     NM_021446
1
                                     NM_025319
                                     NR_038126
   adj.P.Val_GSE_Anderson_TIL_v_Naive.txt
                                           logFC_GSE_Anderson_TIL_v_Naive.txt
0
                                    0.0292
                                                                       0.833661
                                    0.7920
                                                                       0.217723
1
                                    0.2900
                                                                       0.254251
In [16]: # Saving the merged dataframes
         outer_file_name = 'df_merged_outer.txt'
         inner_file_name = 'df_merged_inner.txt'
         output_file(df_merged_outer, output_path, outer_file_name)
         output_file(df_merged_inner, output_path, inner_file_name)
```