Bioinf_project

June 18, 2024

1 Bioinformatics Project - "Exploring the Mechanisms behind S. epidermidis Resistance to Vancomycin using Bioinformatics Analysis"

Code developed by Laís Carvalho (pq52536) 2024

Object of the code:

- Process the expression data in order to obtain a list of overexpressed genes;
- Obtain the graphic representation of the enriched pathways.

1.0.1 Process the expression data in order to obtain a list of overexpressed genes

The expression data is in an excel file.

• The first function created (upload_xlsx_processing()) has the functionality of uploading the excel file and selecting only the names of the genes that follow the input parameters.

Function input: 1. file_path - path of the xlsx file you want to analyze (expression data). 2. FDR_pvalue - determine the significance level to be considered in the statistical test 3. FoldChange - value representing the Fold Change you want to analyze 4. Upregulation - boolean argument, determine whether the analysis is upregulation or downregulation

In addition to forming a txt file with the names of the overexpressed or upregulated genes, the function returns the list of genes and the number of genes in the list.

```
[2]: import pandas as pd

def upload_xlsx_processing(file_path_upload,file_name_output, FDR_pvalue,__

→FoldChange, Upregulation = True):

data = pd.read_excel(file_path_upload)

important_columns = ["Feature ID", "Experiment - Fold Change (original__

→values)", "Baggerley's test: IR VAN vs CT original values - FDR p-value__

→correction"]

df = data[important_columns]

filtrationFDR = df[df["Baggerley's test: IR VAN vs CT original values - FDR__

→p-value correction"] < FDR_pvalue]

if Upregulation:

filtration_FC = filtrationFDR[filtrationFDR["Experiment - Fold Change__

→(original values)"] > FoldChange]
```

• To match the gene names with the identifiers used in STRING and process the information obtained, the following function (string_file_processing()) was developed.

The function takes as input the path of the document obtained from STRING, processes this document and formulates a txt file with the ids, returning a list of these ids.

Application of data processing

• Data processing for the strain: PT11011

```
[17]: # Processing the data and obtaining the final txt file to be applied in ShinyGO.

file_path = "CT vs IR VAN PT11011.xlsx" # Analysis of strain PT11011

results = upload_xlsx_processing(file_path, "genes_PT11011_raw.txt", 0.05, 2, \( \to \)

Upregulation = True)

file_name = "string_mapping_PT11011.tsv"

gene_list_PT11011 = string_file_processing(file_name, "genes_ids_PT11011.txt")

print("Final number of genes:", len(gene_list_PT11011), "\n", "Initial number of \( \to \)

ugenes:", results[1]) # It was observed that 2 genes were tRNA or pseudogenes.
```

Final number of genes: 148
Initial number of genes: 150

• Data processing for the strain: PT12035

Final number of genes: 84
Initial number of genes: 86

1.0.2 Obtain the graphic representation of the enriched pathways

The ShinyGO tool allows graphical visualization of the enriched pathways. However, limitations such as the difficulty in integrating data from different databases, the lack of annotations on the organism studied or the outdated nature of the online tool can interfere with the results and make it impossible to visualize the pathways graphically.

To obtain the graphs of the enriched paths, the following functions were developed:

```
[9]: # Useful python packages
import pandas as pd
from Bio.KEGG import REST
import re
from bioservices import KEGG
```

```
[12]: def gene_name_format(gene_list, term):
           """Function that receives a list of genes and adds the specified term_{\sqcup}
       \hookrightarrow (usually the identification term of the study organism used in KEGG, \sqcup
       \rightarrow accompanied by ":"),
           returns the formatted list of genes"""
           gene_list_form = []
           for gene in gene_list:
               gene_list_form.append(term + gene)
           return gene_list_form
      def get_pathways_shinyGO(file_path, term):
           """It uploads the table (result) obtained to ShinyGO and formulates a_{\sqcup}
       \hookrightarrow dictionary
           that stores the name of the enriched pathway as a key and the list of genes\sqcup
       ⇒associated with this pathway as values"""
           df_ShinyGO = pd.read_csv(file_path)
           pathway_dict = {}
           for index, row in df_ShinyGO.iterrows():
               pathway = row['Pathway']
               gene = row['Genes']
```

```
if pathway not in pathway_dict:
           pathway_dict[pathway] = []
       for x in gene.split(" "):
           pathway_dict[pathway].append(term +x)
   return pathway_dict
def serach_genes_pathways_kegg(gene_list, term):
    """This fuction searches for KEGG pathways associated with a given list of \Box
\hookrightarrow genes.
    The function takes a list of genes as input and returns a dictionary where \sqcup
\hookrightarrow the keys are the gene
   IDs and the values are lists of KEGG pathway IDs associated with each gene"""
   dic = \{\}
   for id_gene in gene_name_format(gene_list, term):
       result = REST.kegg_get(id_gene).read()
       if "PATHWAY" in result:
           linhas = result.split('\n')
           info_pathway = []
           em_pathway = False
           for linha in linhas:
               if linha.startswith("PATHWAY"):
                   em_pathway = True
                   info_pathway.append(linha)
               elif em_pathway and linha.strip() and linha.startswith(" "):
                   info_pathway.append(linha)
               else:
                   em_pathway = False
           info_pathway_str = '\n'.join(info_pathway)
           padrao = r"ser d{5}"
           ocorrencias = re.findall(padrao, info_pathway_str)
           dic[id_gene] = ocorrencias
   else: pass
   return dic
def get_pathway_name(id_pathway):
    ⇒pathway as a string"""
   dic = \{\}
   result = REST.kegg_get(id_pathway).read()
```

```
linhas = result.split("\n")
    res = ""
    for linha in linhas:
        if linha.startswith("NAME"):
            res = linha
    import re
    nome = re.search(r'NAME\s+(.+)', res).group(1)
    return nome
def get_pathways_kegg_dict(genes_pathways):
    """The function takes a dictionary of genes and their associated pathways as_{\sqcup}
→input and returns a new dictionary
    where the keys are the pathway IDs and the values are tuples containing the L
→number of genes associated with the pathway,
    the name of the pathway, and a list of genes associated with the pathway"""
    vias = \{\}
    for g in genes_pathways.keys():
        for via in genes_pathways[g]:
            if via not in vias:
                vias[via] = [g]
            else:
                vias[via].append(g)
    x = dict(sorted(vias.items(), key=lambda item: len(item[1]), reverse = True))
    dic = \{\}
    for via in x.keys():
        dic[via] = (len(x[via]), get_pathway_name(via), x[via])
    return dic
def comparison_kegg_shinygo(dict1, dict2):
    """The function takes two dictionaries as input and returns a new dictionary \sqcup
⇒containing the KEGG pathways that meet certain criteria.
    The function can be used to identify common biological processes or pathways.
⇒that are affected in both datasets."""
    new_dict = {}
    for k1, (KEGG_count, name, genes1) in dict1.items():
        max_count = 0
        k max = None
        for k2, genes2 in dict2.items():
            genes_c = set(genes1) & set(genes2)
            count = len(genes_c)
            if count > max_count:
                max_count = count
                k_max = k2
        if k_max:
            new_dict[k1] = (KEGG_count, name, k_max, max_count)
```

```
dic_final = {}
    for keys, (KEGG_count, name, _, max_count) in new_dict.items():
        if KEGG_count >= 2 and max_count/KEGG_count >= 0.5:
            dic_final[keys] = (KEGG_count, name)
    return dic_final
def relevant_pathways(dict_comparation, general_keys_to_remove, path_dict):
    """The purpose of this function is to filter out irrelevant pathways and |--
\neg create a new dictionary with the relevant pathways and their associated \sqcup
⇒genes"""
    keys_to_remove = general_keys_to_remove
    dic_final = {chave: valor for chave, valor in dict_comparation.items() if ___
→chave not in keys_to_remove}
    dict_final_wgenes = {}
    for k in dic_final.keys():
        dict_final_wgenes[k] = path_dict[k]
    return dict_final_wgenes
def get_url_pathway(target_path, target_genes, color_backgroud, color_line):
    """The purpose of this function is to generate a URL that can be used to_\sqcup
⇒visualize a KEGG pathway with specific genes highlighted"""
    s = KEGG()
    target_kos = {}
    for gene in target_genes:
        target_kos[gene] = "{},{}".format(color_backgroud, color_line)
    url = s.show_pathway(target_path, scale= None, keggid=target_kos, show=True)
    return url
```

Aplication

• PT11011:

```
[19]: # uploading ShinyGO results

file_path = 'enrichment_PT11011.csv'

pathways_shinygo = get_pathways_shinyGO(file_path, "ser:")

# Search for the pathways related to the genes obtained from processing the data______

in the KEGG database.

kegg_search = serach_genes_pathways_kegg(gene_list_PT11011, "ser:")
```

```
[20]: # From the search obtained in KEGG, form the dictionary for comparison with the

→result in ShinyGO

pathways_kegg = get_pathways_kegg_dict(kegg_search)

pathways_kegg
```

```
[20]: {'ser03010': (35,
        'Ribosome - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0179',
         'ser:SERP1828',
         'ser:SERP1831',
         'ser:SERP1830',
         'ser:SERP1819',
         'ser:SERP1816',
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         'ser:SERP1798',
         'ser:SERP1832',
         'ser:SERP1806',
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         'ser:SERP1818',
         'ser:SERP1822',
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         'ser:SERP1827']),
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        'Metabolic pathways - Staphylococcus epidermidis RP62A (MRSE)',
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         'ser:SERP2177',
         'ser:SERP2185',
         'ser:SERP2192',
          'ser:SERP2191',
         'ser:SERP0152',
         'ser:SERP0109',
```

```
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   'ser:SERP0036',
   'ser:SERP0094',
   'ser:SERP0095',
   'ser:SERP0202',
   'ser:SERP1280',
   'ser:SERP2115',
   'ser:SERP1279']),
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  'ABC transporters - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0099',
   'ser:SERP0246',
   'ser:SERP1951',
   'ser:SERP1952',
   'ser:SERP2003',
   'ser:SERP2004',
   'ser:SERP2005',
   'ser:SERP2081']),
 'ser01110': (6,
  'Biosynthesis of secondary metabolites - Staphylococcus epidermidis RP62A
(MRSE)',
  ['ser:SERP1810',
   'ser:SERP0152',
   'ser:SERP0868',
   'ser:SERP0109',
   'ser:SERP0036',
   'ser:SERP0095']),
 'ser01230': (6,
  'Biosynthesis of amino acids - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0152',
   'ser:SERP0109',
   'ser:SERP1166',
   'ser:SERP0036',
   'ser:SERP0094',
   'ser:SERP0095']),
 'ser00920': (5,
  'Sulfur metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP2185',
   'ser:SERP2192',
   'ser:SERP2191',
   'ser:SERP0152',
   'ser:SERP0095']),
 'ser01120': (5,
  'Microbial metabolism in diverse environments - Staphylococcus epidermidis
RP62A (MRSE)',
  ['ser:SERP2185',
```

```
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   'ser:SERP0109']),
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  'Cysteine and methionine metabolism - Staphylococcus epidermidis RP62A
(MRSE)',
  ['ser:SERP0152',
   'ser:SERP1166',
   'ser:SERP0036',
   'ser:SERP0094'.
   'ser:SERP0095']),
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 'ser00730': (3,
  'Thiamine metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1810', 'ser:SERP1280', 'ser:SERP1279']),
 'ser01240': (3,
  'Biosynthesis of cofactors - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1810', 'ser:SERP1280', 'ser:SERP1279']),
 'ser00260': (3,
  'Glycine, serine and threonine metabolism - Staphylococcus epidermidis RP62A
  ['ser:SERP2176', 'ser:SERP2177', 'ser:SERP0095']),
 'ser02020': (3.
  'Two-component system - Staphylococcus epidermidis RP62A (MRSE)',
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 'ser01232': (2,
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  ['ser:SERP1810', 'ser:SERP0202']),
 'ser00552': (2,
  'Teichoic acid biosynthesis - Staphylococcus epidermidis RP62A (MRSE)',
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 'ser01503': (2,
  'Cationic antimicrobial peptide (CAMP) resistance - Staphylococcus epidermidis
RP62A (MRSE)',
  ['ser:SERP0519', 'ser:SERP0521']),
 'ser03020': (2.
  'RNA polymerase - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1805', 'ser:SERP0184']),
 'ser02024': (2,
  'Quorum sensing - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0448', 'ser:SERP0618']),
 'ser03060': (2,
  'Protein export - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0448', 'ser:SERP0552']),
```

```
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 'ser00970': (1,
  'Aminoacyl-tRNA biosynthesis - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1024']),
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  'Carbon metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0152']),
 'ser00564': (1,
  'Glycerophospholipid metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0868']),
 'ser00250': (1,
  'Alanine, aspartate and glutamate metabolism - Staphylococcus epidermidis
RP62A (MRSE)',
  ['ser:SERP0109']),
 'ser00910': (1,
  'Nitrogen metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0109']),
 'ser00550': (1,
  'Peptidoglycan biosynthesis - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1020']),
 'ser01501': (1,
  'beta-Lactam resistance - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1020']),
 'ser03070': (1,
  'Bacterial secretion system - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0448']),
 'ser00450': (1,
  'Selenocompound metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0036']),
 'ser00240': (1,
  'Pyrimidine metabolism - Staphylococcus epidermidis RP62A (MRSE)',
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  ['ser:SERP0450']),
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  ['ser:SERP1703']),
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  ['ser:SERP1703']),
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  ['ser:SERP1703']),
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```
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        ['ser:SERP1931']),
       'ser02040': (1,
        'Flagellar assembly - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP2005']),
       'ser00620': (1,
        'Pyruvate metabolism - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP2115'])}
[21]: # Compare the results obtained and obtain the important pathways
      compared_dicts = comparison_kegg_shinygo(pathways_kegg, pathways_shinygo)
      compared_dicts
[21]: {'ser03010': (35, 'Ribosome - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser01100': (17,
        'Metabolic pathways - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser02010': (8, 'ABC transporters - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser01110': (6,
        'Biosynthesis of secondary metabolites - Staphylococcus epidermidis RP62A
      (MRSE)'),
       'ser01230': (6,
        'Biosynthesis of amino acids - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser00920': (5,
        'Sulfur metabolism - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser01120': (5,
        'Microbial metabolism in diverse environments - Staphylococcus epidermidis
      RP62A (MRSE)'),
       'ser00270': (5,
        'Cysteine and methionine metabolism - Staphylococcus epidermidis RP62A
      (MRSE)'),
       'ser00730': (3,
        'Thiamine metabolism - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser01240': (3,
        'Biosynthesis of cofactors - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser02020': (3,
        'Two-component system - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser00552': (2,
        'Teichoic acid biosynthesis - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser01503': (2,
        'Cationic antimicrobial peptide (CAMP) resistance - Staphylococcus epidermidis
      RP62A (MRSE)'),
       'ser03020': (2, 'RNA polymerase - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser02024': (2, 'Quorum sensing - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser03060': (2, 'Protein export - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser04122': (2,
        'Sulfur relay system - Staphylococcus epidermidis RP62A (MRSE)')}
```

```
[22]: # Remove general, non-fundamental pathways to conclusions
      keys_to_remove = ['ser01100', 'ser01110', 'ser01120']
      relevant_paths = relevant_pathways(compared_dicts, keys_to_remove, pathways_kegg)
      relevant_paths
[22]: {'ser03010': (35,
        'Ribosome - Staphylococcus epidermidis RP62A (MRSE)',
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  'Biosynthesis of amino acids - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0152',
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   'ser:SERP1166',
   'ser:SERP0036',
   'ser:SERP0094',
   'ser:SERP0095']),
 'ser00920': (5,
  'Sulfur metabolism - Staphylococcus epidermidis RP62A (MRSE)',
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   'ser:SERP2192',
   'ser:SERP2191',
   'ser:SERP0152',
   'ser:SERP0095']),
 'ser00270': (5,
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(MRSE)',
  ['ser:SERP0152',
   'ser:SERP1166',
   'ser:SERP0036',
   'ser:SERP0094',
   'ser:SERP0095']),
 'ser00730': (3,
  'Thiamine metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1810', 'ser:SERP1280', 'ser:SERP1279']),
 'ser01240': (3,
  'Biosynthesis of cofactors - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1810', 'ser:SERP1280', 'ser:SERP1279']),
 'ser02020': (3,
  'Two-component system - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0519', 'ser:SERP0521', 'ser:SERP1980']),
 'ser00552': (2,
  'Teichoic acid biosynthesis - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0519', 'ser:SERP0521']),
 'ser01503': (2,
  'Cationic antimicrobial peptide (CAMP) resistance - Staphylococcus epidermidis
RP62A (MRSE)',
  ['ser:SERP0519', 'ser:SERP0521']),
 'ser03020': (2,
  'RNA polymerase - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1805', 'ser:SERP0184']),
```

```
'ser02024': (2,
        'Quorum sensing - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0448', 'ser:SERP0618']),
       'ser03060': (2,
        'Protein export - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0448', 'ser:SERP0552']),
       'ser04122': (2,
        'Sulfur relay system - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP1280', 'ser:SERP1279'])}
[23]: # Get the urls with the graphic images and the highlighted genes of interest
      for v in relevant_paths:
          url = get_url_pathway(v, relevant_paths[v][2], "yellow", "red")
          print(url)
     http://www.kegg.jp/kegg-bin/show_pathway?ser03010/default%3dpink//ser:SERP0179%0
     9yellow,red//ser:SERP1828%09yellow,red//ser:SERP1831%09yellow,red//ser:SERP1830%
     O9yellow,red//ser:SERP1819%O9yellow,red//ser:SERP1816%O9yellow,red//ser:SERP0180
     %09yellow,red//ser:SERP0178%09yellow,red//ser:SERP0181%09yellow,red//ser:SERP179
     9%09yellow,red//ser:SERP1821%09yellow,red//ser:SERP1824%09yellow,red//ser:SERP18
     15%09yellow,red//ser:SERP1242%09yellow,red//ser:SERP1211%09yellow,red//ser:SERP1
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     1823%09yellow,red//ser:SERP1813%09yellow,red//ser:SERP0718%09yellow,red//ser:SER
     P1243%09yellow,red//ser:SERP0823%09yellow,red//ser:SERP1825%09yellow,red//ser:SE
     RP1284%09yellow,red//ser:SERP1814%09yellow,red//ser:SERP1817%09yellow,red//ser:S
     ERP1798%09yellow,red//ser:SERP1832%09yellow,red//ser:SERP1806%09yellow,red//ser:
     SERP1807%09yellow,red//ser:SERP1818%09yellow,red//ser:SERP1822%09yellow,red//ser
     :SERP0046%09yellow,red//ser:SERP1827%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser02010/default%3dpink//ser:SERP0099%0
     9yellow,red//ser:SERP0246%09yellow,red//ser:SERP1951%09yellow,red//ser:SERP1952%
     09yellow,red//ser:SERP2003%09yellow,red//ser:SERP2004%09yellow,red//ser:SERP2005
     %09yellow,red//ser:SERP2081%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser01230/default%3dpink//ser:SERP0152%0
     9yellow,red//ser:SERP0109%09yellow,red//ser:SERP1166%09yellow,red//ser:SERP0036%
     09yellow,red//ser:SERP0094%09yellow,red//ser:SERP0095%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser00920/default%3dpink//ser:SERP2185%0
     9yellow,red//ser:SERP2192%09yellow,red//ser:SERP2191%09yellow,red//ser:SERP0152%
     09yellow,red//ser:SERP0095%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser00270/default%3dpink//ser:SERP0152%0
     9yellow,red//ser:SERP1166%09yellow,red//ser:SERP0036%09yellow,red//ser:SERP0094%
     09yellow,red//ser:SERP0095%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser00730/default%3dpink//ser:SERP1810%0
     9yellow,red//ser:SERP1280%09yellow,red//ser:SERP1279%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser01240/default%3dpink//ser:SERP1810%0
     9yellow,red//ser:SERP1280%09yellow,red//ser:SERP1279%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser02020/default%3dpink//ser:SERP0519%0
     9yellow,red//ser:SERP0521%09yellow,red//ser:SERP1980%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser00552/default%3dpink//ser:SERP0519%0
```

9yellow,red//ser:SERP0521%09yellow,red/

9yellow,red//ser:SERP0521%09yellow,red/

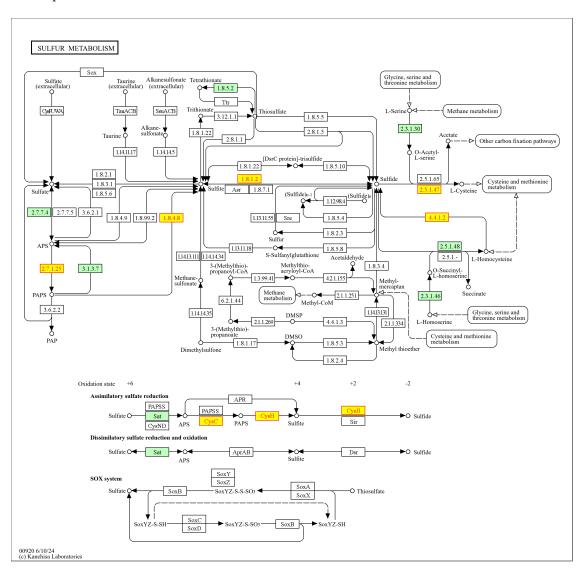
9yellow,red//ser:SERP0184%09yellow,red/

http://www.kegg.jp/kegg-bin/show_pathway?ser02024/default%3dpink//ser:SERP0448%09yellow,red//ser:SERP0618%09yellow,red/

http://www.kegg.jp/kegg-bin/show_pathway?ser03060/default%3dpink//ser:SERP0448%09yellow,red//ser:SERP0552%09yellow,red/

http://www.kegg.jp/kegg-bin/show_pathway?ser04122/default%3dpink//ser:SERP1280%09yellow,red//ser:SERP1279%09yellow,red/

• Exemple of the URL result



• PT12035

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[24]: # uploading ShinyGO results
      file_path = 'enrichment_PT12035.csv'
      pathways_shinygo = get_pathways_shinyGO(file_path, "ser:")
      # Search for the pathways related to the genes obtained from processing the data_
       \hookrightarrow in the KEGG database.
      kegg_search = serach_genes_pathways_kegg(gene_list_PT12035, "ser:")
[25]: # From the search obtained in KEGG, form the dictionary for comparison with the
       \rightarrow result in ShinyGO
      pathways_kegg = get_pathways_kegg_dict(kegg_search)
      pathways_kegg
[25]: {'ser02010': (14,
        'ABC transporters - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0957',
         'ser:SERP0958',
         'ser:SERP0959',
         'ser:SERP0960',
         'ser:SERP1951',
         'ser:SERP1952',
         'ser:SERP2003',
         'ser:SERP2004',
         'ser:SERP2005',
         'ser:SERP2283',
         'ser:SERP2284',
         'ser:SERP2285',
         'ser:SERP2286',
         'ser:SERP2355']),
       'ser01100': (12,
        'Metabolic pathways - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP2192',
         'ser:SERP0520',
         'ser:SERP2297',
         'ser:SERP2388',
         'ser:SERP2346',
         'ser:SERP0018',
         'ser:SERP0094',
         'ser:SERP0095',
         'ser:SERP0196',
         'ser:SERP0197',
         'ser:SERP2336',
         'ser:SERP2343']),
       'ser00561': (6,
        'Glycerolipid metabolism - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP2297',
         'ser:SERP2388',
         'ser:SERP2346',
```

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'ser:SERP0018',
   'ser:SERP2336',
   'ser:SERP2343']),
 'ser00552': (3,
  'Teichoic acid biosynthesis - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0520', 'ser:SERP0521', 'ser:SERP0198']),
 'ser01503': (3,
  'Cationic antimicrobial peptide (CAMP) resistance - Staphylococcus epidermidis
RP62A (MRSE)',
  ['ser:SERP0520', 'ser:SERP0521', 'ser:SERP2252']),
 'ser02020': (3.
  'Two-component system - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0520', 'ser:SERP0521', 'ser:SERP0960']),
 'ser02024': (3,
  'Quorum sensing - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP1322', 'ser:SERP0950', 'ser:SERP1397']),
 'ser00920': (2,
  'Sulfur metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP2192', 'ser:SERP0095']),
 'ser01110': (2,
  'Biosynthesis of secondary metabolites - Staphylococcus epidermidis RP62A
(MRSE)',
  ['ser:SERP0868', 'ser:SERP0095']),
 'ser00270': (2,
  'Cysteine and methionine metabolism - Staphylococcus epidermidis RP62A
(MRSE)'.
  ['ser:SERP0094', 'ser:SERP0095']),
 'ser01230': (2,
  'Biosynthesis of amino acids - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0094', 'ser:SERP0095']),
 'ser00040': (2,
  'Pentose and glucuronate interconversions - Staphylococcus epidermidis RP62A
(MRSE)',
  ['ser:SERP0196', 'ser:SERP0197']),
 'ser01120': (1,
  'Microbial metabolism in diverse environments - Staphylococcus epidermidis
RP62A (MRSE)',
  ['ser:SERP2192']),
 'ser00470': (1,
  'D-Amino acid metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0520']),
 'ser00640': (1,
  'Propanoate metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP2346']),
 'ser00564': (1,
  'Glycerophospholipid metabolism - Staphylococcus epidermidis RP62A (MRSE)',
  ['ser:SERP0868']),
```

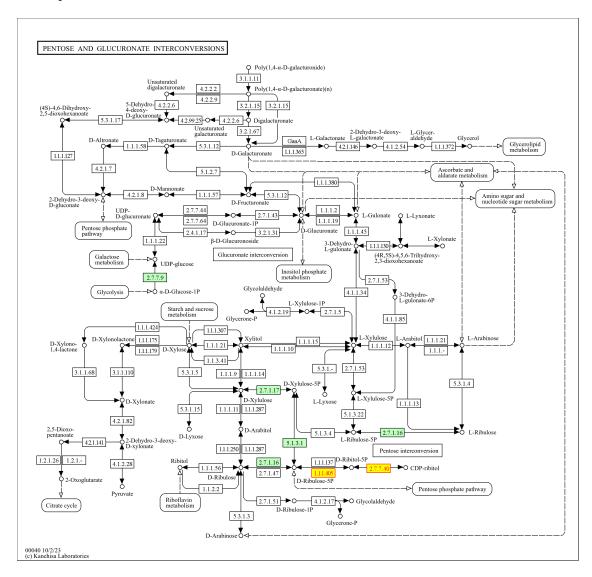
```
'ser00260': (1,
        'Glycine, serine and threonine metabolism - Staphylococcus epidermidis RP62A
      (MRSE)',
        ['ser:SERP0095']),
       'ser02040': (1,
        'Flagellar assembly - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP2005'])}
[26]: # Compare the results obtained and obtain the important pathways
      compared_dicts = comparison_kegg_shinygo(pathways_kegg, pathways_shinygo)
      compared_dicts
[26]: {'ser02010': (14,
        'ABC transporters - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser00561': (6,
        'Glycerolipid metabolism - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser00552': (3,
        'Teichoic acid biosynthesis - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser01503': (3,
        'Cationic antimicrobial peptide (CAMP) resistance - Staphylococcus epidermidis
      RP62A (MRSE)'),
       'ser02020': (3,
        'Two-component system - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser02024': (3, 'Quorum sensing - Staphylococcus epidermidis RP62A (MRSE)'),
       'ser00040': (2,
        'Pentose and glucuronate interconversions - Staphylococcus epidermidis RP62A
      (MRSE)')}
[27]: # Remove general, non-fundamental pathways to conclusions
      keys_to_remove = []
      relevant_paths = relevant_pathways(compared_dicts, keys_to_remove, pathways_kegg)
      relevant_paths
[27]: {'ser02010': (14,
        'ABC transporters - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0957',
         'ser:SERP0958',
         'ser:SERP0959',
         'ser:SERP0960',
         'ser:SERP1951',
         'ser:SERP1952',
         'ser:SERP2003',
         'ser:SERP2004',
         'ser:SERP2005',
         'ser:SERP2283',
         'ser:SERP2284',
         'ser:SERP2285',
```

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'ser:SERP2355']),
       'ser00561': (6,
        'Glycerolipid metabolism - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP2297',
         'ser:SERP2388',
         'ser:SERP2346',
         'ser:SERP0018',
         'ser:SERP2336',
         'ser:SERP2343']),
       'ser00552': (3.
        'Teichoic acid biosynthesis - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0520', 'ser:SERP0521', 'ser:SERP0198']),
       'ser01503': (3,
        'Cationic antimicrobial peptide (CAMP) resistance - Staphylococcus epidermidis
      RP62A (MRSE)',
        ['ser:SERP0520', 'ser:SERP0521', 'ser:SERP2252']),
       'ser02020': (3,
        'Two-component system - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP0520', 'ser:SERP0521', 'ser:SERP0960']),
       'ser02024': (3,
        'Quorum sensing - Staphylococcus epidermidis RP62A (MRSE)',
        ['ser:SERP1322', 'ser:SERP0950', 'ser:SERP1397']),
       'ser00040': (2.
        'Pentose and glucuronate interconversions - Staphylococcus epidermidis RP62A
      (MRSE)'.
        ['ser:SERP0196', 'ser:SERP0197'])}
[28]: # Get the urls with the graphic images and the highlighted genes of interest
      for v in relevant_paths:
          url = get_url_pathway(v, relevant_paths[v][2], "yellow", "red")
          print(url)
     http://www.kegg.jp/kegg-bin/show_pathway?ser02010/default%3dpink//ser:SERP0957%0
     9yellow,red//ser:SERP0958%09yellow,red//ser:SERP0959%09yellow,red//ser:SERP0960%
     09yellow,red//ser:SERP1951%09yellow,red//ser:SERP1952%09yellow,red//ser:SERP2003
     %09yellow,red//ser:SERP2004%09yellow,red//ser:SERP2005%09yellow,red//ser:SERP228
     3%09yellow,red//ser:SERP2284%09yellow,red//ser:SERP2285%09yellow,red//ser:SERP22
     86%09yellow,red//ser:SERP2355%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser00561/default%3dpink//ser:SERP2297%0
     9yellow,red//ser:SERP2388%09yellow,red//ser:SERP2346%09yellow,red//ser:SERP0018%
     09yellow,red//ser:SERP2336%09yellow,red//ser:SERP2343%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser00552/default%3dpink//ser:SERP0520%0
     9yellow,red//ser:SERP0521%09yellow,red//ser:SERP0198%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser01503/default%3dpink//ser:SERP0520%0
     9yellow,red//ser:SERP0521%09yellow,red//ser:SERP2252%09yellow,red/
     http://www.kegg.jp/kegg-bin/show_pathway?ser02020/default%3dpink//ser:SERP0520%0
     9yellow,red//ser:SERP0521%09yellow,red//ser:SERP0960%09yellow,red/
```

'ser:SERP2286',

http://www.kegg.jp/kegg-bin/show_pathway?ser02024/default%3dpink//ser:SERP1322%0 9yellow,red//ser:SERP0950%09yellow,red//ser:SERP1397%09yellow,red/ http://www.kegg.jp/kegg-bin/show_pathway?ser00040/default%3dpink//ser:SERP0196%0 9yellow,red//ser:SERP0197%09yellow,red/

• Exemple of the URL result



1.0.3 References

Programming for KEGG (The James Hutton Institute): https://widdowquinn.github.io/2018-03-06-ibioic/02-sequence databases/09-KEGG programming.html

BioServices (GitHub): https://github.com/cokelaer/bioservices/blob/main/src/bioservices/kegg.py BioServices tutorial: https://bioservices.readthedocs.io/en/main/kegg tutorial.html#introduction