## fig\_deseq\_summary

July 30, 2020

## 0.0.1 Fig DESeq Summary (Fig. 5 & Fig. S5)

- 5A: Scatterplot to show correlation between depleted and input quantseq using CPM from HTSeq quantification.
- 5B: MA plot of depleted vs. input quant-seq
- 5C: Bar plot for complementarity to the probes for genes going down + depletion vs other genes.
  - Make associated supplemental fig 5: Used the Stellar aligner to find regions of complementarity between the probes and the rRNAs and other genes
- $\bullet\,$  S5A: complementarity length vs. % identity for genes complementary to probes
- S5B: complementarity length vs. % identity for genes complementary to rRNAs

```
[1]: #Imports
     import sys
     import pandas as pd
     import matplotlib.pyplot as plt
     import matplotlib
     import os
     import gffutils
     import seaborn as sns
     import numpy as np
     import scipy.stats
     import itertools
     import matplotlib.ticker as plticker
     import shutil
     sys.path.append('../scripts/')
     from plot_helpers import *
     %matplotlib inline
     %load_ext autoreload
     %autoreload 2
     db = gffutils.FeatureDB(gffutils_db)
```

```
[2]: outdir = '../figures/F5/'
os.makedirs(outdir, exist_ok = True)
```

```
[3]: #Load gene biotypes:
    biotype_dict = {}
    for i in db.all_features(featuretype = 'gene'):
        this_gene = i.id
        try:
            biotype = db[this_gene].attributes['gene_biotype'][0]
            genename = db[this_gene].attributes['gene_name'][0]
             #change biotype to rRNA if rRNA is in the name -- occurs for some_{\sqcup}
      \rightarrowpseudogenes
            if 'rRNA' in genename:
                biotype = 'rRNA'
        except KeyError:
            biotype = 'spike-in' #only the spike-ins don't have a biotype
        biotype_dict[this_gene] = biotype
[4]: #the htseq quantification file
    htseq_file = os.path.join(results_dir, 'rnaseq_data_200723/gene_quantification/
     df = pd.read_csv(htseq_file)
     #Drop the SIRV, spikein values and the non-gene rows
    nospike_df = df[~df['gene'].apply(lambda x: (x.startswith('SIRV') or x.
     ⇒startswith('__')))].copy().set_index('gene')
     #get CPM values
    nospike_df['CPM'] = nospike_df['counts']*1e6/nospike_df.groupby(['experiment',_
     →'replicate'])['counts'].transform('sum')
    mean_df = nospike_df.groupby(['gene', 'experiment']).mean()
    mean_df.reset_index('experiment', inplace = True)
[5]: #Get the input and subtracted values, put back together
    in_df = mean_df.loc[mean_df['experiment'] == 'inputq', 'CPM'].copy()
    sub_df = mean_df.loc[mean_df['experiment'] == 'subtractedq', 'CPM'].copy()
    comp_df = pd.merge(in_df, sub_df, left_index = True, right_index = True,__
     ⇔suffixes = ('_in', '_sub'))
     #restrict to genes with mean TPM >= 1
    filtered_df = comp_df[(comp_df['CPM_in'] >= 1) & (comp_df['CPM_sub'] >= 1)].
    filtered_df['CPM_in_log10'] = filtered_df['CPM_in'].apply(np.log10)
    filtered df['CPM sub log10'] = filtered df['CPM sub'].apply(np.log10)
    filtered_df['biotype'] = filtered_df.index.map(biotype_dict)
     #get data specifically from protein coding and ncRNAs:
```

```
coding_ncRNA = ['protein_coding', 'ncRNA']
filtered_df['coding_ncRNA'] = filtered_df['biotype'].isin(coding_ncRNA)
cfilt_df = filtered_df[filtered_df['coding_ncRNA']].copy()

rval, pval = scipy.stats.pearsonr(cfilt_df['CPM_in'], cfilt_df['CPM_sub'])
r2_val_av = rval**2
print('r2 val from averages', r2_val_av)
```

r2 val from averages 0.935091481025752

```
[6]: #Get the r2 values between subtracted and input for each replicate
    exps = ['inputq', 'subtractedq']
    reps = ['rep1', 'rep2', 'rep3']
    #get data specifically from protein coding and ncRNAs:
    nospike_df['biotype'] = nospike_df.index.map(biotype_dict)
    nospike df['coding ncRNA'] = nospike df['biotype'].isin(coding ncRNA)
    cnc_df = nospike_df[nospike_df['coding_ncRNA']].copy()
    rep_df = cnc_df.set_index(['experiment', 'replicate'], append = True)
    #Get r**2 for depleted vs. input samples at each replicate
    for r in reps:
        print(r)
        x_df = rep_df.loc[pd.IndexSlice[:, exps[0], r], 'CPM'].
     →reset_index(['experiment', 'replicate'])
        y_df = rep_df.loc[pd.IndexSlice[:, exps[1], r], 'CPM'].
     →reset_index(['experiment', 'replicate'])
        c_df = pd.merge(x_df, y_df, left_index = True, right_index = True, suffixes_
     f df = c df[(c df['CPM in'] >= 1) & (c df['CPM sub'] >= 1)].copy()
        rval, pval = scipy.stats.pearsonr(f_df['CPM_in'], f_df['CPM_sub'])
        r2 val = rval**2
        print(r2_val)
```

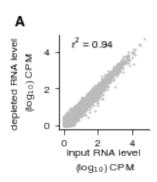
```
rep1
0.9435917453761333
rep2
0.8884779296223968
rep3
0.9506970994140393
```

```
[7]: #Get the interreplicate r2 values
for e in exps:
    print('experiment: %s' % e)
    for c in itertools.combinations(reps, 2):
        print('%s\t%s' % (c[0], c[1]))
```

```
x_df = rep_df.loc[pd.IndexSlice[:, e, c[0]], 'CPM'].

¬reset_index(['experiment', 'replicate'])
             y_df = rep_df.loc[pd.IndexSlice[:, e, c[1]], 'CPM'].
      →reset_index(['experiment', 'replicate'])
             c_df = pd.merge(x_df, y_df, left_index = True, right_index = True,
      ⇔suffixes = ('_in', '_sub'))
             f_df = c_df[(c_df['CPM_in'] >= 1) & (c_df['CPM_sub'] >= 1)].copy()
             rval, pval = scipy.stats.pearsonr(f_df['CPM_in'], f_df['CPM_sub'])
             r2 val = rval**2
             print(r2_val)
    experiment: inputq
    rep1
            rep2
    0.9612159001240881
    rep1
            rep3
    0.9501540563680244
    rep2
            rep3
    0.8643445768888421
    experiment: subtractedq
    rep1
            rep2
    0.9811717421669452
    rep1
            rep3
    0.9354702058719863
    rep2
            rep3
    0.8940539713313329
[8]: #Plot the correlation between input and depleted libraries
     panel name = '5A'
     plot = Plotter(corners = [0.27, 0.27, 0.6, 0.6], figsize = (sfig, sfig))
     plot.nudge_corners(left = True, right = True)
     plot.setup_axis()
     pointsize = 0.5
     plot.ax.scatter(cfilt_df['CPM_in_log10'], cfilt_df['CPM_sub_log10'], s = __
      →pointsize)
     plot.set_ylabel('depleted RNA level\n (log'r'\$_{10}\$'') CPM', nudge = (0.015, 0))
     plot.set_xlabel('input RNA level\n (log'r'$_{10}$'') CPM')
     loc = plticker.MultipleLocator(base=2.0)
     plot.ax.xaxis.set_major_locator(loc)
     plot.ax.yaxis.set_major_locator(loc)
     plot.ax.set_xlim(-0.25, 5)
     plot.ax.set_xlim(-0.25, 5)
     plot.ax.text(0.4, 4.2, 'r'r'\$^2\$'' = \%1.2f' \% r2_val_av, fontsize = 8)
```

```
plot.add_letter('A', ha = 'right')
plt.savefig(os.path.join(outdir, '{}.{}'.format(panel_name, outfmt)), dpi = 600)
```



```
[9]: #Fig 5B, quantifying probe matches of downregulated genes vs. other genes
     def get_count_table(df, value, category):
         I I I
         Return a dataframe containing counts of
         a specific value. For example length or bitscore.
         Create a column labeled category with the name for the bar plot
         count_s = df[value].value_counts().to_frame().rename(columns = {value:
      count df = pd.DataFrame(count s)
         count_df['percent_counts'] = (count_df['counts']/count_df['counts'].
      \rightarrowsum())*100
         count_df[value] = count_df.index
         label = '%s\n(n = %s)' % (category, count_df['counts'].sum())
         count_df['category'] = label
         return count_df, label
     def add_gene(x):
         gene = next(db.parents(x, featuretype = 'gene')).id
         return gene
```

```
deseq_df['biotype'] = deseq_df.index.map(biotype_dict)
padj_threshold = 0.01
deseq_df['increased'] = (deseq_df['log2FoldChange'] > 0) & (deseq_df['padj'] <__
→padj_threshold)
deseq df['decreased'] = (deseq df['log2FoldChange'] < 0) & (deseq df['padj'] < 1.</pre>
→padj_threshold)
#Alternative values if padj cutoff = 0.05
padj_threshold2 = 0.05
deseq_df['increased_0.05'] = (deseq_df['log2FoldChange'] > 0) &__

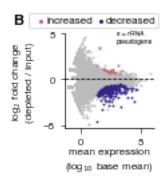
    deseq_df['padj'] < padj_threshold2)
</pre>
deseq_df['decreased_0.05'] = (deseq_df['log2FoldChange'] < 0) &__

→ (deseq_df['padj'] < padj_threshold2)

#find increased or decreased rRNAs that have non-NA values for the padj
uprrnas = deseq_df[(deseq_df['increased']) & (deseq_df['biotype'] == 'rRNA')].
→index
downrrnas = deseq_df[(deseq_df['decreased']) & (deseq_df['biotype'] == 'rRNA')].
→index
changing_rrnas = np.append(uprrnas.values, downrrnas.values)
#remove these rRNAs from the df, so that I can plot them with a different symbol
ndf = deseq_df.drop(changing_rrnas)
#make space for the legend
plot = Plotter(corners = [0.32, 0.27, 0.6, 0.6], figsize = (sfig, sfig))
plot.nudge_corners(left = True, right = True)
plot.setup_axis()
pointsize = 0.5
bg = plot.ax.scatter('log10_baseMean', 'log2FoldChange', data = ndf, s = __
→pointsize)
up = plot.ax.scatter('log10_baseMean', 'log2FoldChange', data = __

→ndf[ndf['increased']],
                     s = pointsize, color = color_dict['rose'])
down = plot.ax.scatter('log10_baseMean', 'log2FoldChange', data = __
→ndf[ndf['decreased']],
                     s = pointsize, color = color_dict['indigo'])
plot.ax.axhline(y = 0, color = 'k', linestyle = '--')
plot.ax.legend([up, down], ['increased', 'decreased'], ncol = 2, __
\rightarrowbbox_to_anchor=(-0.41, 1.1, 1.45, .102),
```

```
fontsize = 8, borderpad = 0.2, borderaxespad=0., labelspacing = 1
 →0, handletextpad = -0.5, mode = 'expand', markerscale = 3)
up_rrna = plot.ax.scatter('log10_baseMean', 'log2FoldChange', data = deseq_df.
→loc[uprrnas],
                     s = 5, color = color_dict['rose'], marker = 'x')
down_rrna = plot.ax.scatter('log10_baseMean', 'log2FoldChange', data = deseq_df.
→loc[downrrnas],
                     s = 5, color = color dict['indigo'], marker = 'x')
#rRNA genes changing
#FBgn0267523 5.8S pseudogene -- up
#FBqn0085813 18S pseudogene -- down
ytext = 'log'r'$_{2}$' ' fold change\n(depleted / input)'
xtext = 'mean expression\n(log'r'\$_{10}\$' ' base mean)'
plot.set_xlabel(xtext)
plot.set_ylabel(ytext, nudge = (0.015, 0))
plot.ax.text(3, 4, 'x = rRNA\npseudogene', fontsize = 5)
#borderpad effects the box size but it is unevenly distributed - left one is,
⇒still over on right a bit
plot.add_letter('B', ha = 'right')
plt.savefig(os.path.join(outdir, '{}.{}'.format(panel_name, outfmt)), dpi = 600)
```



```
[11]: #Get genes that are both not rRNAs and also have an assigned padj -- this means they must also have met an expression threshold #https://support.bioconductor.org/p/76144/ #This explains that the genes with padj NA basically don't have high enough expression to be included.

#get 'non-zero' genes (ones quantified well enough to have a non-NA padj)
```

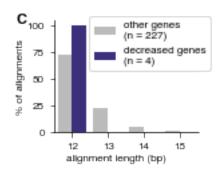
```
nz_df = deseq_df.dropna(subset = ['padj'])
      #qet non-zero, non-ribo genes
     non_ribo_df = nz_df[nz_df['biotype'] != 'rRNA'].copy()
     decreased_genes = non_ribo_df[non_ribo_df['decreased']].index
     increased_genes = non_ribo_df[non_ribo_df['increased']].index
     other_genes = non_ribo_df[~non_ribo_df['decreased']].index
     nonzero_genes = non_ribo_df.index
     print('number non-zero genes', len(nonzero_genes))
     print('number of increased genes', len(increased_genes))
     print('number of down genes', len(decreased_genes))
     print('number of other/non-down genes', len(other_genes))
      #write non-zero genes to file to use for the Stellar homology search
     with open(os.path.join(outdir, 'nonzero_genes.csv'), 'w') as f:
         for i in nonzero_genes:
             f.write(f'{i}\n')
     print('median change increased', 2**non_ribo_df.loc[increased_genes,u
      change_decreased = 2**non_ribo_df.loc[decreased_genes, 'log2FoldChange'].
     print('median change decreased', change_decreased)
     print('median fc decreased', 1/change_decreased)
     print('percent of non-zero genes decreased', len(decreased_genes)*100/
       →len(nonzero_genes))
     number non-zero genes 7323
     number of increased genes 23
     number of down genes 208
     number of other/non-down genes 7115
     median change increased 1.9028127532276042
     median change decreased 0.46214277889342004
     median fc decreased 2.1638334421116667
     percent of non-zero genes decreased 2.8403659702307795
[12]: #Alternative values if padj cutoff = 0.05
     increased_genes2 = non_ribo_df[non_ribo_df['increased_0.05']].index
     decreased_genes2 = non_ribo_df[non_ribo_df['decreased_0.05']].index
     print('number of increased genes', len(increased_genes2))
     print('number of down genes', len(decreased_genes2))
```

```
print('median change increased', 2**non_ribo_df.loc[increased_genes2,__
      → 'log2FoldChange'].median())
      change_decreased = 2**non_ribo_df.loc[decreased_genes2, 'log2FoldChange'].
      →median()
      print('median change decreased', change_decreased)
      print('median fc decreased', 1/change_decreased)
     number of increased genes 82
     number of down genes 359
     median change increased 1.7725287935122847
     median change decreased 0.5129365645391377
     median fc decreased 1.9495588131808816
[13]: #Fig 5C, Plot matches to genes decreased after depletion vs. other genes using
      \hookrightarrow Blast results
      #Revised counting of probe transcriptome alignments using only the spliced and \square
      \rightarrow longest version of each txt:
      homol_file = os.path.join(results_dir, 'probe_design_results/

dmel_homol_check_200715/probeoff_e500.csv')
      homol_df = pd.read_csv(homol_file, names = ['qseqid', 'sseqid', 'pident', _
      'mismatch', 'gapopen', 'qstart', 'qend', 'sstart', 'send', 'evalue', 'bitscore'])
      #extract the plus strand alignments, since this would indicate potential probe⊔
      →hyb since we aligned the reverse complement
      homol_df['strand'] = homol_df.apply(lambda x: 'plus' if x['send'] > x['sstart']__
      →else 'minus', axis = 1)
      pdf = homol_df[homol_df['strand'] == 'plus'].copy()
      ident_df = pdf[pdf['pident'] == 100].copy()
      #add gene symbol
      ident_df['gene'] = ident_df['sseqid'].apply(add_gene)
      #count matches to decreased genes vs. all other genes
      lengths_used = [12, 13, 14, 15]
      ident_df['down'] = ident_df['gene'].isin(decreased_genes)
      ident_df['other'] = ident_df['gene'].isin(other_genes)
      ident_df = ident_df.loc[ident_df['length'].isin(lengths_used)].copy()
      gene_count_down, gene_down_label = get_count_table(ident_df[ident_df['down']],__
      gene_count_other, gene_other_label =_u

-get_count_table(ident_df[ident_df['other']], 'length', 'other genes')
      gene_count_df = pd.concat([gene_count_down, gene_count_other])
[14]: #Plot matches to genes decreased after depletion vs. other genes using Blast
      \rightarrow results
```

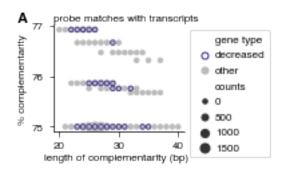
panel name = '5C'



```
[15]: #Make Fig. S5
outdir2 = '../figures/FS5/'
os.makedirs(outdir2, exist_ok = True)
```

```
[17]: #Plot matches for complementarity between probes and genes using Stellar
      \rightarrowhomology search
      loc = plticker.MultipleLocator(base=1.0)
      panel_name = 'S5A'
      plot = Plotter(corners = [0.14, 0.24, 0.52, 0.67], figsize = (sfig*1.65, sfig))
      plot.nudge_corners(left = True, right = True)
      plot.setup_axis()
      plot.ax = sns.scatterplot(x = 'length', y = 'percent_id', size = 'counts', data__
      ⇒= bdf, hue = 'gene type',
                                hue_order = ['decreased', 'other'], edgecolor = 'face',
                                palette = [color_dict['indigo'], color_dict['grey']])
      #set the decreased genes to unfilled circles
      indigo = np.array(matplotlib.colors.to_rgba(color_dict['indigo']))
      collections = plot.ax.collections
      for c in collections:
          facecol = c.get_facecolor()
          c.set_edgecolor(facecol)
          ec = c.get_edgecolor()
          #match indigo ones to transparent
          new_colors = ['none' if (i == indigo).all() else i for i in facecol]
          c.set facecolor(new colors)
      plot.ax.yaxis.set_major_locator(loc)
      plot.set_ylabel('% complementarity')
      plot.set_xlabel('length of complementarity (bp)', nudge = (-0.01, 0))
      \#plot.ax.text(0.5, 1.04, 'probe matches with mRNA', ha = 'center', transform = ___
       →plot.ax.transAxes, fontsize = label_fontsize)
```

total alignments 9151 decreased 154 other 8997 percent of decreased alns 1.682876188394711



```
[18]: #Fig. S5B, Plot matches for complementarity between rRNA and genes using Stellar_

⇒homology search

#combine the 18S and 28S files:

stellar_18S_file = os.path.join(results_dir, 'probe_design_results/

⇒dmel_homol_check_200715/18S_st_30_75p.gff')

stellar_28S_file = os.path.join(results_dir, 'probe_design_results/

⇒dmel_homol_check_200715/28S_st_30_75.gff')

stellar_rrna_combo = os.path.join(results_dir, 'probe_design_results/

⇒dmel_homol_check_200715/rrna_st_30_75p.gff')
```

```
with open(stellar_rrna_combo, 'wb') as outFile:
   with open(stellar_18S_file, 'rb') as f1, open(stellar_28S_file, 'rb') as f2:
       shutil.copyfileobj(f1, outFile)
       shutil.copyfileobj(f2, outFile)
stellar_df = pd.read_csv(stellar_rrna_combo, sep = '\t', names = ['txt_id',__
'percent_id', 'strand', 'phase', 'cigar'])
stellar_df['length'] = stellar_df['end'] - stellar_df['start'] + 1
stellar_df['gene'] = stellar_df['txt_id'].apply(add_gene)
stellar_df['down'] = stellar_df['gene'].isin(decreased_genes)
stellar_df['other'] = stellar_df['gene'].isin(other_genes)
odf = stellar_df[stellar_df['other']].copy()
ddf = stellar_df[stellar_df['down']].copy()
#https://stackoverflow.com/questions/19384532/
\rightarrow get-statistics-for-each-group-such-as-count-mean-etc-using-pandas-groupby
ocount = odf.groupby(['percent_id', 'length']).size().reset_index(name =_
dcount = ddf.groupby(['percent_id', 'length']).size().reset_index(name =__
ocount['gene type'] = 'other'
dcount['gene type'] = 'decreased'
bdf = pd.concat([ocount, dcount])
loc = plticker.MultipleLocator(base=1.0)
```

```
ec = c.get_edgecolor()
    #match indigo ones to transparent
    new_colors = ['none' if (i == indigo).all() else i for i in facecol]
    c.set_facecolor(new_colors)
plot.ax.yaxis.set_major_locator(loc)
plot.set_ylabel('% complementarity')
plot.set_xlabel('length of complementarity (bp)', nudge = (-0.01, 0))
#plot.ax.text(0.5, 1.04, 'rRNA matches with transcripts', ha = 'center',
→ transform = plot.ax.transAxes, fontsize = label_fontsize)
plot.ax.text(0, 1.04, 'rRNA matches with transcripts', ha = 'left', transform =
 →plot.ax.transAxes, fontsize = label_fontsize)
plot.ax.legend(ncol = 1, fontsize = label_fontsize, bbox_to_anchor= (1, 1), ___
 \hookrightarrowhandletextpad = 0)
plot.add_letter('B')
plt.savefig(os.path.join(outdir2, '{}.{}'.format(panel_name, outfmt)), dpi = __
decreased_gene_aln = dcount['counts'].sum()
other_gene_aln = ocount['counts'].sum()
total_aln = decreased_gene_aln + other_gene_aln
percent_decreased_aln = decreased_gene_aln*100/total_aln
print('total alignments', total_aln)
print('decreased', decreased_gene_aln)
print('other', other_gene_aln)
print('percent of decreased alns', percent_decreased_aln)
```

total alignments 20000 decreased 310 other 19690 percent of decreased alns 1.55

