Bacterial Feature Finder (BaFF) – A system for extracting features overrepresented in sets of prokaryotic organisms

Supplementary Material

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1.- Statistical Tests

Enrichment analysis statistics were computed using functions from the R stats package [1].

For quantitative features (continuous values), a two Sample, two-sided Kolmogorov-Smirnov test (R function: **ks.test()**) was used for checking if both sets of values (input set and background) have the same distribution. We report the p-value of rejecting the hypothesis that both distributions are different.

For qualitative features (discrete values), we compute the probability of obtaining a given annotation randomly from the background set using the cumulative hypergeometric density function (R function: **phyper ()**). In these cases a p-value correction for multiple testing is also performed, with Benjamini's False Discovery Rate (FDR) correction [2] (R function: **p.adjust()**).

[1] R Core Team (2015). R: A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria. URL https://www.R-project.org/.

[2] Benjamini, Y. and Hochberg, Y. (1995) Controlling the false discovery rate: A practical and powerful approach to multiple testing. Journal of the Royal Statistical Society, Series B. 57: 289-300.

2.- Features and sources

Feature	e	Source Database	URL
٠	Number of	EnsemblGenomes	https://img.jgi.doe.gov/cgi-bin/m/main.cgi
	genes		
			http://ensemblgenomes.org/info/genomes
٠	GC content	NCBI Genome	https://www.ncbi.nlm.nih.gov/genome/
•	Biosystems	NCBI biosystems	https://www.ncbi.nlm.nih.gov/biosystems
٠	COG Functional	Microbesonline	http://www.microbesonline.org/cgi-
	Classes (25)		bin/genomeInfo.cgi
٠	Gram staining	Integrated	https://img.jgi.doe.gov/
•	Sporulation	Microbial	
•	Motility	genomes (IMG)	
٠	Shape		
٠	Biotic		
	Relationships		
٠	Phenotype		
٠	Oxigen		
	requirement		
٠	Temperature		
	range		
٠	Disease		
٠	Host		
•	Taxonomy	NCBI Taxonomy	https://www.ncbi.nlm.nih.gov/Taxonomy/

3.- Screenshots of the interface

BaFF Bacterial Features Fin	ıder		BaFF Help/Tutorial
Bacterial Featu	res		
Get a list of bacter	ia sharing one or more of the following	criteria. You can use it as input for an ov	errepresentation analysis.
Taxonomy ID	Name	Disease	Taxonomy
997825	Escherichia coli O157:H7	Tularemia	Enterobacterales
Gram staining	Biosystems	Phenotype	Sporulation Motility
- •	-	· -	· · · ·
Temperature range	e Oxygen requirement	Biotic relationships Cell Sh	ape
Number of gene	s:	%GC content: _	
In case you don't p			bacterial features.
Input Set	Browse	Background Set	
		background.bkt	Browse
Get enriched features			
		onal Systems Biology Group · CNB - CSIC oport: jlopezibanez{at}cnb.csic.es	

Main interface

bacteri	a matching	your criteria found.	
ŧ +	Tax ID 🗘	Name +	Lineage
1	2342	Candidatus Sodalis pierantonius str. SOPE	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Pectobacteriaceae>Sodalis>Candidatus Sodalis pierantonius
2	36870	Wigglesworthia glossinidia endosymbiont of Glossina brevipalpis	Bacteria > Proteo bacteria > Gamma proteo bacteria > Entero bacterales > Enviniacea e > Wiggles worthia > Wiggles worthia gloss inidia and the second seco
3	66270	Pantoea stewartii subsp. indologenes	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Erwiniaceae>Pantoea>Pantoea stewartii
4	98360	Salmonella enterica subsp. enterica serovar Dublin	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Salmonella>Salmonella enterica
5	99287	Salmonella enterica subsp. enterica serovar Typhimurium str. LT2	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Salmonella>Salmonella enterica
6	107806	Buchnera aphidicola str. APS (Acyrthosiphon pisum)	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enviniaceae>Buchnera>Buchnera aphidicola
7	187410	Yersinia pestis KIM10+	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Yersiniaceae>Yersinia>Yersinia pestis
8	198214	Shigella flexneri 2a str. 301	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Shigella>Shigella flexneri
9	198804	Buchnera aphidicola str. Sg (Schizaphis graminum)	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Erwiniaceae>Buchnera>Buchnera aphidicola
10	199310	Escherichia coli CFT073	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Escherichia>Escherichia coli
11	203907	Candidatus Blochmannia floridanus	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Candidatus Blochmannia
12	209261	Salmonella enterica subsp. enterica serovar Typhi str. Ty2	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Salmonella>Salmonella enterica
13	215689	Erwinia sp. Ejp617	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Erwiniaceae>Erwinia
14	216597	Salmonella enterica subsp. enterica serovar Typhimurium str. SL1344	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Salmonella>Salmonella enterica
15	216599	Shigella sonnei 53G	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Shigella>Shigella sonnei
16	218491	Pectobacterium atrosepticum SCRI1043	Bacteria > Proteo bacteria > Gamma proteo bacteria > Entero bacterales > Pecto bacteria ceae > Pecto bacterium > Pecto bacterium at rosepticum at roseptic
17	218493	Salmonella bongori NCTC 12419	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Salmonella>Salmonella bongori
18	220341	Salmonella enterica subsp. enterica serovar Typhi str. CT18	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Enterobacteriaceae>Salmonella>Salmonella enterica
19	224915	Buchnera aphidicola str. Bp (Baizongia pistaciae)	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Erwiniaceae>Buchnera>Buchnera aphidicola
20	229193	Yersinia pestis biovar Microtus str. 91001	Bacteria>Proteobacteria>Gammaproteobacteria>Enterobacterales>Yersiniaceae>Yersinia>Yersinia pestis

Paginated results of a database search

	results for the findings of a 692 out of 692 IDs	previous search	n. Using the defaul	t backgrou	nd set.				
u can show/hide dif	fferent categories of feature	s in the results	table with the box	es below:					
 ☑ Biosystems ☑ Sporulation 	 Biotic Relationships Oxigen requirement 	☑ Motility ☑ Disease	☑ Taxonomy ☑ Phenotype	Shap 🗹 Shap	e 🛛 Temperature ra 🖉 COG code	nge			
Save Results	Feature				0-1	\$	p-value \$	FDR	4
%GC content	reature			-	Category %GC content	÷	0.00e+0	-	-
				Biosystems		1.33e-8	2.33e-8		
2-Aminoethylphosphonate transport system 2-Oxocarboxylic acid metabolism				Biosystems		8.13e-4	1.19e-3		
A: RNA processing and modification				COG code		0.00e+0	-		
Acyrthosiphon pisum				Host		1.30e-7	3.65e-6		
Adenine ribonucleotide biosynthesis, IMP => ADP,ATP				Biosystems		1.38e-6	2.26e-6		
Adhesin protein transport system				Biosystems		7.64e-12	1.45e-11		
ADP-L-glycero-D-manno-heptose biosynthesis				Biosystems		0.00e+0	0.00e+0		
AI-2 transport system			1	Biosystems		0.00e+0	0.00e+0		
Alanine, aspartate and glutamate metabolism			1	Biosystems		3.11e-3	4.40e-3		
alpha-Hemolysin/cyclolysin transport system			1	Biosystems		2.07e-4	3.12e-4		
alpha-Linolenic acid metabolism				Biosystems		0.00e+0	0.00e+0		
Aminobenzoate degradation				Biosystems		4.74e-12	9.04e-12		
Aminoglycoside resistance, protease FtsH				Biosystems		0.00e+0	0.00e+0		
Aminoglycoside resistand	ce, protease HtpX				Biosystems		0.00e+0	0.00e+0	
Arachidonic acid metabolism				Biosystems		0.00e+0	0.00e+0		
ArcB-ArcA (anoxic redox control) two-component regulatory system				Biosystems		0.00e+0	0.00e+0		
Arginine and proline meta	bolism				Biosystems		6.28e-2	8.06e-2	
Arginine biosynthesis				Biosystems		3.56e-5	5.48e-5		
Arginine transport system				Biosystems		0.00e+0	0.00e+0		
Ascorbate and aldarate metabolism				Biosystems		4.43e-13	8.65e-13		
Accorbate degradation au	scorbate => D-xylulose-5P				Biosystems		0.00e+0	0.00e+0	

Results of the analysis of enriched features.