

Ontology Enrichment and Analysis

Explotación semántica de datos
Máster Universitario en Bioinformática



Functional enrichment of GO biological processes and KEGG pathway enrichment analysis in the identified Dynamic Network Biomarkers (DNB) of two diseases

Disease	DNB	GO term	P-value	Description
Acute Lung Injury	{ GCLC; ASNS; PGD; EPHA2; TXNL1; SRXN1; CH25H; HSPA1A; HSPA1B; CYP51; DNAJC5; DNAJB4; HMOX1; GADD45G; PMAIP1; ... }	GO:0006979	7.6E-10	response to oxidative stress
		GO:0009611	1.4E-6	response to wounding
		GO:0050727	1.5E-8	oxidation reduction
		GO:0006629	6.9E-6	lipid biosynthetic process
		GO:0055114	2.7E-5	regulation of inflammatory response
HBV induced liver cancer	{ B2M; GCC2; HDAC10; STAT6; CACH-1; HLA-DMA; TAP1; CDH1; YWHAB; NAP1L1; ... }	GO:0010629	0.0029	antigen processing and presentation
		GO:0019882	0.0056	intracellular protein transport
		GO:0006886	0.0189	chromosome organization
		GO:0006325	0.023	negative regulation of gene expression
		GO:0045191	0.024	regulation of isotype switching

Acute lung injury		HBV induced liver cancer	
Pathway term	P-value	Pathway term	P-value
Pathway in cancer	1.54E-6	Acute myeloid leukemia	1.28E-4
MAPK signaling pathway	4.42E-6	Pathways in cancer	5.51E-4
p53 signaling pathway	6.57E-6	Leishmaniasis	1.43E-3
Chronic myeloid leukemia	4.08E-5	Pentose and glucuronate interconversions	3.51E-3
Hepatitis C	4.71E-5	Cytosolic DNA-sensing pathway	3.70E-3
Adipocytokine signaling pathway	7.95E-5	Adipocytokine signaling pathway	4.45E-3
Acute myeloid leukemia	5.12E-5	Hepatitis C	5.56E-3
Leishmaniasis	9.02E-5	Pancreatic cancer	6.17E-3
Cell cycle	1.14E-4	Toll-like receptor signaling pathway	6.80E-3

Tissue-specific clocks in Arabidopsis show asymmetric coupling

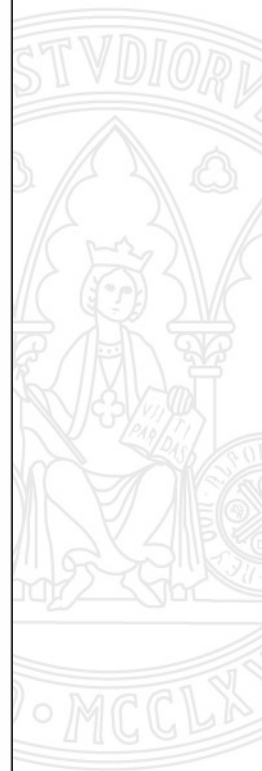
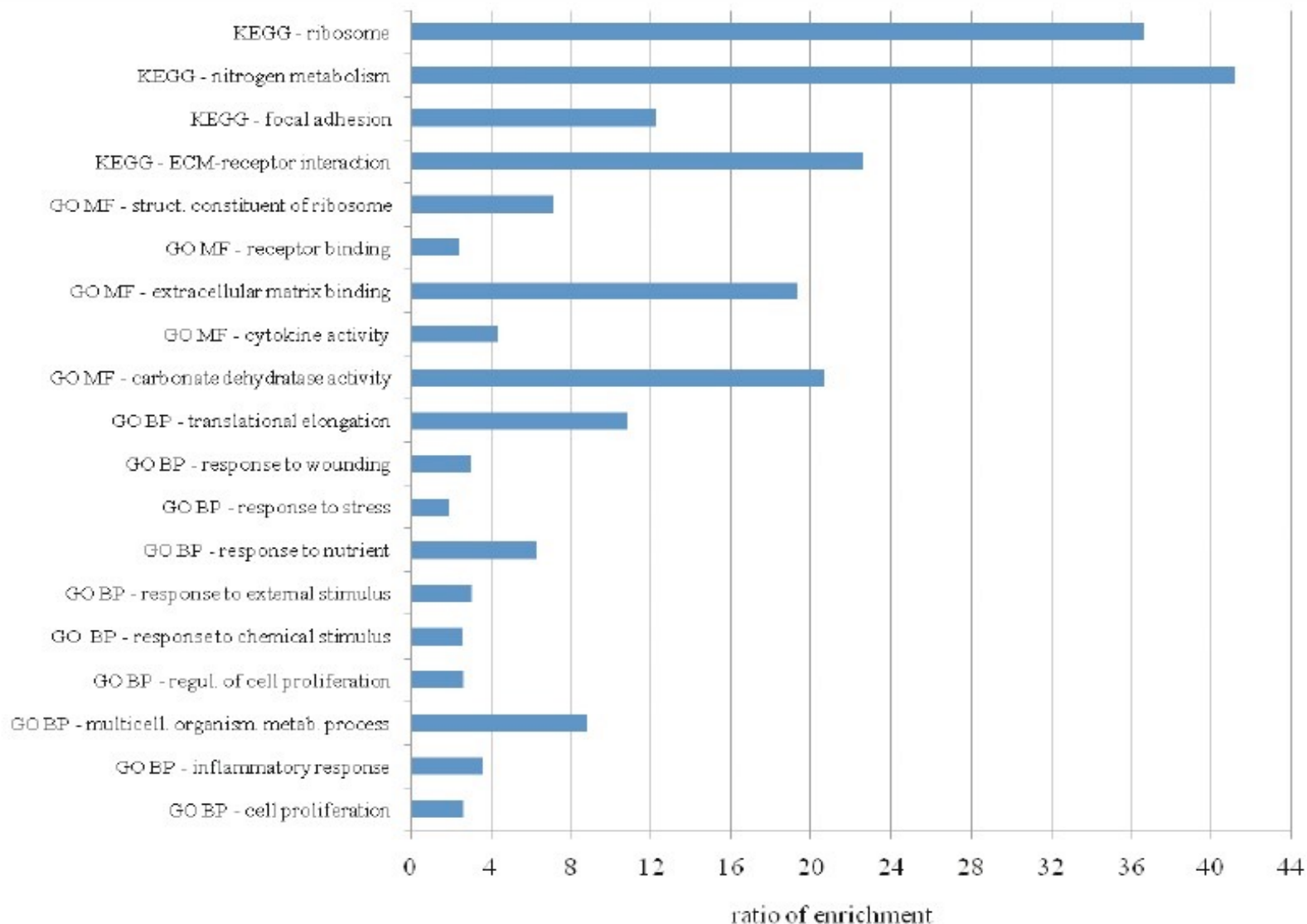
Gene ontology slim term enrichment analysis

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Functional category	Whole genome	Mesophyll-rich genes		Vasculature-rich genes	
	Gene count	Gene count	<i>P</i> value	Gene count	<i>P</i> value
Other cellular processes	13639	160	5.01×10^{-7}	129	0.808
Other metabolic processes	12844	159	7.56×10^{-9}	107	0.995
Unknown biological processes	9047	35	1	80	0.913
Protein metabolism	4970	36	0.929	32	0.999
Response to stress	4092	56	5.48×10^{-4}	49	0.0948
Developmental processes	3844	47	0.0138	50	0.0278
Response to abiotic or biotic stimulus	3739	73	2.88×10^{-11}	43	0.174
Other biological processes	3555	43	0.0217	57	1.72×10^{-4}
Transport	3497	68	2.14×10^{-10}	42	0.113
Cell organization and biogenesis	3328	43	0.00752	27	0.894
Transcription,DNA-dependent	2547	15	0.970	20	0.893
Signal transduction	2002	17	0.613	20	0.526
DNA or RNA metabolism	919	0	1	6	0.898
Electron transport or energy pathways	592	25	1.46×10^{-10}	4	0.843

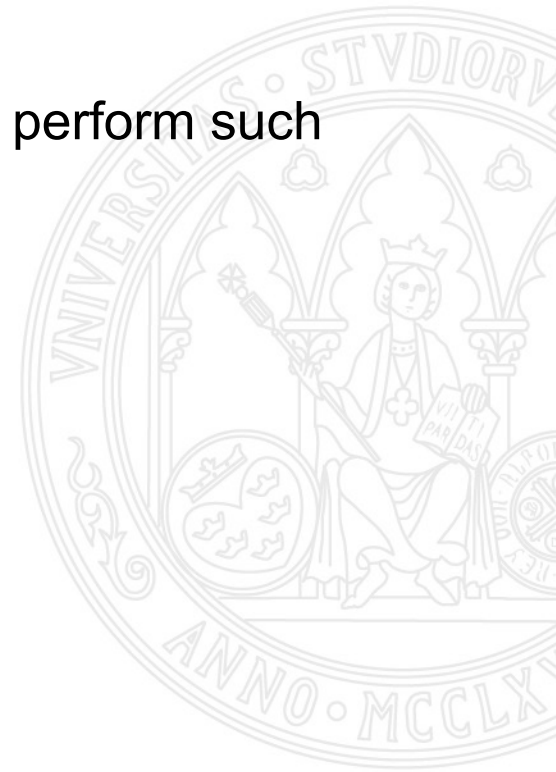
Systematic enrichment analysis of gene expression profiling studies identifies consensus pathways implicated in colorectal cancer development

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Ontology Enrichment Analysis

- Given a set of genes of interest (with some particular properties), find which ontology terms are overrepresented using the annotations for the global set of genes.
- The hierarchical structure of the ontologies permit to perform such studies at different levels
- Not only GO can be used for enrichment analysis
- KEGG: which pathways are overrepresented



- Use of a subset of genes of interest

To determine whether any GO terms annotate a specified list of genes at a frequency greater than that would be expected by chance, GO::TermFinder calculates a *P*-value using the hypergeometric distribution:

$$P=1 - \sum_{i=0}^{k-1} \frac{\binom{M}{i} \binom{N-M}{n-i}}{\binom{N}{i}}.$$

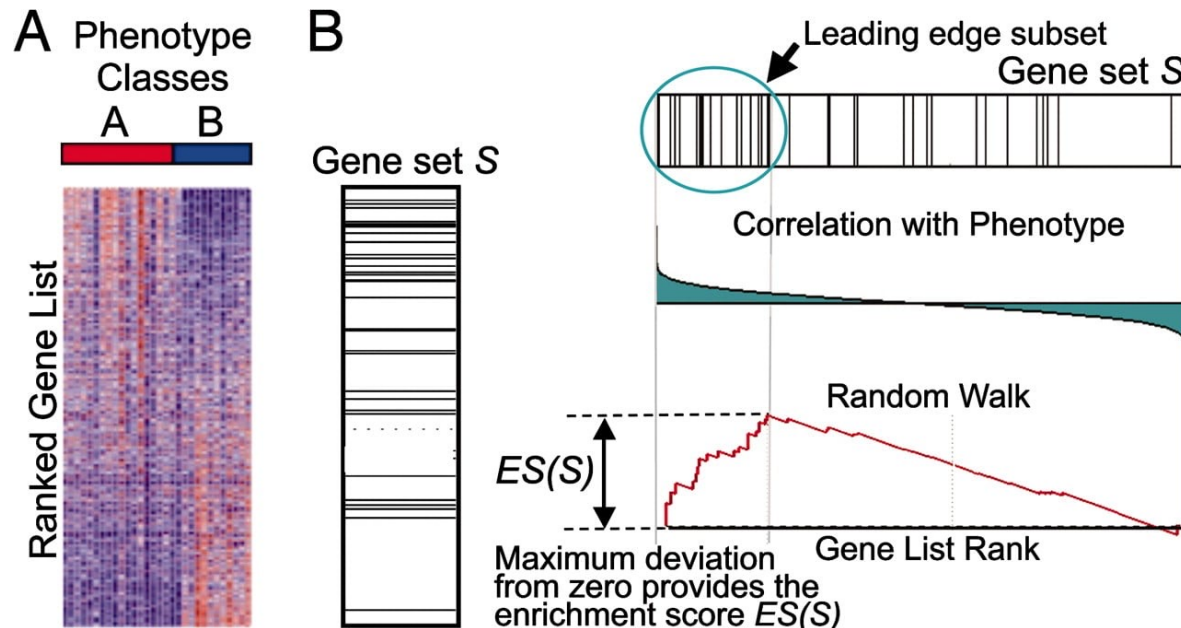
In this equation, *N* is the total number of genes in the background distribution, *M* is the number of genes within that distribution that are annotated (either directly or indirectly) to the node of interest, *n* is the size of the list of genes of interest and *k* is the number of genes within that list which are annotated to the node. The background distribution by default is all the genes within a given annotation file, though the software also allows a user-defined background distribution, such that biases in the sampling population (e.g. the genes represented on a microarray) can be accounted for correctly. The hypergeometric distribution is sampling without replacement—for instance, consider a bag with 500 red and 500 green beads. If 20 beads were selected randomly, and beads were not replaced after each selection, and 17 were green, we would use the hypergeometric distribution to calculate the *P*-value as the probability of picking 17, or more, green beads from 20, given that there are 500 of each in the background distribution.

<http://geneontology.org/docs/go-enrichment-analysis/>



Gene Set Enrichment Analysis

- Use of all the genes associated with the functional concept, not only a subset of interest



(A) An expression data set sorted by correlation with phenotype, the corresponding heat map, and the “gene tags,” i.e., location of genes from a set S within the sorted list. (B) Plot of the running sum for S in the data set, including the location of the maximum enrichment score (ES) and the leading-edge subset.

Ontology Enrichment

- Online enrichment
 - Gene Ontology
 - Reactome
- R libraries for ontology enrichment
 - CLUSTERPROFILER
 - <https://bioconductor.org/packages/release/bioc/html/clusterProfiler.html>
 - GPROFILER
 - <https://cran.r-project.org/web/packages/gProfileR/index.html>



GO Enrichment Analysis

Enrichment analysis

CACTIN
PIP5K1C
DAPK3
EEF2
PLPP2
PLPPR3

cellular component

Homo sapiens

Submit

Results ?

	Reference list	upload_1
Mapped IDs:	20814	17
Unmapped IDs:	0	2

Export results

Displaying all results; [click here to display only results with P<0.05](#)

	Homo sapiens (REF)	upload_1 (▼ Hierarchy NEW! ?)				
GO cellular component complete	#	#	expected	Fold Enrichment	+/-	P value
polysomal ribosome	7	1	.01	> 100	+	1.00E00
↳ polysome	40	1	.03	30.61	+	1.00E00
↳ intracellular ribonucleoprotein complex	745	3	.61	4.93	+	1.00E00
↳ intracellular part	13674	16	11.17	1.43	+	1.00E00

Enrichment Analysis in Reactome

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REACTOME
A CURATED PATHWAY DATABASE

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e.g. O95631, NTN1, signaling Search




Browse Pathways



Analyze Data



Reactome FI Network



User Guide



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Current Version: Reactome V54



reactome
@reactome

2 Nov

Our upgraded search tool has better performance, an improved results display, and integrated help desk access [#solrucene](#)



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26 Oct

Enrichment Analysis in Reactome

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Analyse your data

This tool merges pathway identifier mapping, overrepresentation and expression analysis into a single tabbed data analysis portal, with integrated visualization and summary features.

Select a file from your computer and click on the "GO" button to perform the analysis.

Select data file for analysis No se ha seleccionado ningún archivo. ☒ Project to human

GO

▼ Click here to paste your data or try example data sets...

Paste the data to analyse

Some examples:

Uniprot accession list

Gene name list

Gene NCBI / Entrez list

Small molecules (ChEBI)

Small molecules (KEGG)

Microarray data

Metabolomics data

GO

#Small_molecules_KEGG

C00001
C00002
C00003
C00004
C00005
C00006
C00007
C00008
C00009
C00010

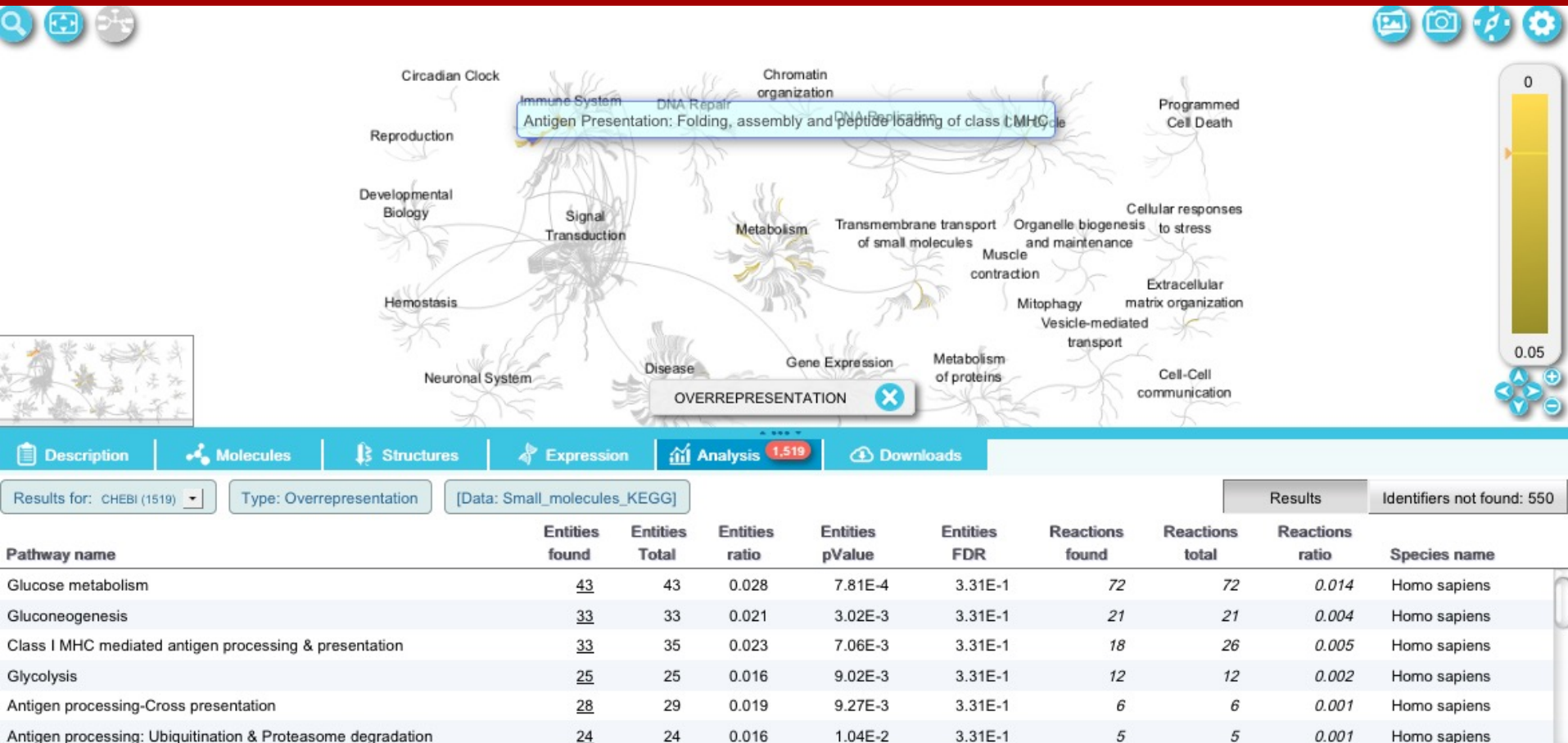
Clear

☒ Project to human



Enrichment Analysis in Reactome

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Exercises – Online Enrichment Analysis

- AulaVirtual (Recursos → prácticas
→ enrichment → ejercicio1-
GOREactomeOnlineEnrichment.pdf)



- AulaVirtual (Recursos → prácticas → enrichment → ejercicio2-EnrichmentR.pdf)
- Upload to Rstudio: Recursos → prácticas → enrichment → files-enrichment.zip



Questions, comments...

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