

Introduction to Transcriptomics Analysis

Class 15 - Downstream Analysis I GO Term Analysis



INSTRUCTOR:

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- 1. Basics about GO Terms.
- 2. GO Enrichment Analysis
- 3. Tools to analyse GO Terms.
 - 3.1. Web based tools
 - 3.1.1. Gene Ontology
 - 3.1.2. GOrilla
 - 3.2. R packages
 - 3.2.1. GO.db
 - 3.2.2. TopGO
 - 3.2.3. GOProfiles
 - 3.2.4. GOSim



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Gene ontologies:

Structured controlled vocabularies (ontologies) that describe gene products in terms of their associated

biological processes,

cellular components and

molecular functions

in a species-independent manner

http://www.geneontology.org/GO.doc.shtml

Ontology

Property	Value
Valid terms	44411 ($\Delta = -97$)
Obsoleted terms	2947 ($\Delta = 23$)
Merged terms	2056 ($\Delta = 91$)
Biological process terms	29112
Molecular function terms	11118
Cellular component terms	4181

Annotations

Property	Value		
Number of annotations	7,975,639		
Annotations for biological process	3,069,526		
Annotations for molecular function	2,455,089		
Annotations for cellular component	2,451,024		
Annotations for evidence PHYLO	4,163,423		
Annotations for evidence IEA	1,978,576		
Annotations for evidence EXP	759,654		
Annotations for evidence OTHER	791,743		
Annotations for evidence ND	241,978		
Annotations for evidence HTP	40,265		
Number of annotated scientific publications	159,963		



Biological processes,

Recognized series of events or molecular functions. A process is a collection of molecular events with a defined beginning and end.

Cellular components,

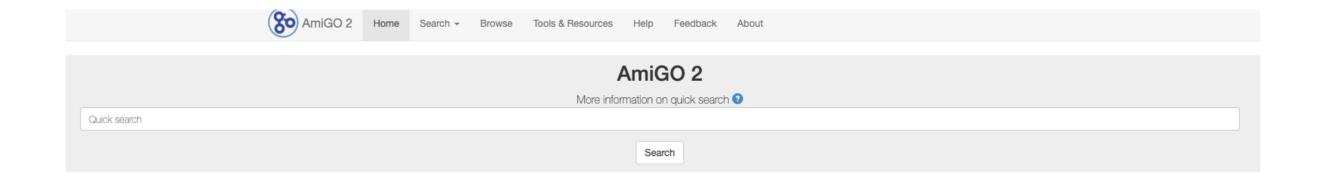
Describes locations, at the levels of subcellular structures and macromolecular complexes.

Molecular functions

Describes activities, such as catalytic or binding activities, that occur at the molecular level.



The information about the Gene Ontology terms can be retrieved at: http://amigo.geneontology.org/amigo/landing





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Term Information 2 Accession GO:0007165 Name signal transduction Ontology biological_process Synonyms signaling pathway, signalling pathway, signaling cascade, signalling cascade Alternate IDs GO:0023033 Definition The cellular process in which a signal is conveyed to trigger a change in the activity or state of a cell. Signal transduction begins with reception of a signal (e.g. a ligand binding to a receptor or receptor activation by a stimulus such as light), or for signal transduction in the absence of ligand, signal-withdrawal or the activity of a constitutively active receptor. Signal transduction ends with regulation of a downstream cellular process, e.g. regulation of transcription or regulation of a metabolic process. Signal transduction covers signaling from receptors located on the surface of the cell and signaling via molecules located within the cell. For signaling between cells, signal transduction is restricted to events at and within the receiving cell. Source: GOC:mtg_signaling_feb11, GOC:go_curators Comment Note that signal transduction is defined broadly to include a ligand interacting with a receptor, downstream signaling steps and a response being triggered. A change in form of the signal in every step is not necessary. Note that in many cases the end of this process is regulation of the initiation of transcription. Note that specific transcription factors may be annotated to this term, but core/general transcription machinery such as RNA polymerase should not History See term history for GO:0007165 at QuickGO Subset goslim_metagenomics goslim_aspergillus goslim chembl goslim_plant R GO:0008150 biological_process goslim_generic goslim_candida ■ GO:0065007 biological regulation Related Link to all genes and gene products annotated to signal transduction. R GO:0009987 cellular process Link to all direct and indirect annotations to signal transduction. Link to all direct and indirect annotations download (limited to first 10,000) for signal transduction. ■ GO:0050789 regulation of biological process GO:0050896 response to stimulus GO:0007154 cell communication GO:0051716 cellular response to stimulus ■ GO:0050794 regulation of cellular process



P GO:0023052 signaling

- GO:0097190 apoptotic signaling pathway
- GO:0038183 bile acid signaling pathway
- GO:0099004 calmodulin dependent kinase signaling pathway
- GO:0009756 carbohydrate mediated signaling
- GO:0007166 cell surface receptor signaling pathway
- GO:0010019 chloroplast-nucleus signaling pathway
- GO:0007212 dopamine receptor signaling pathway

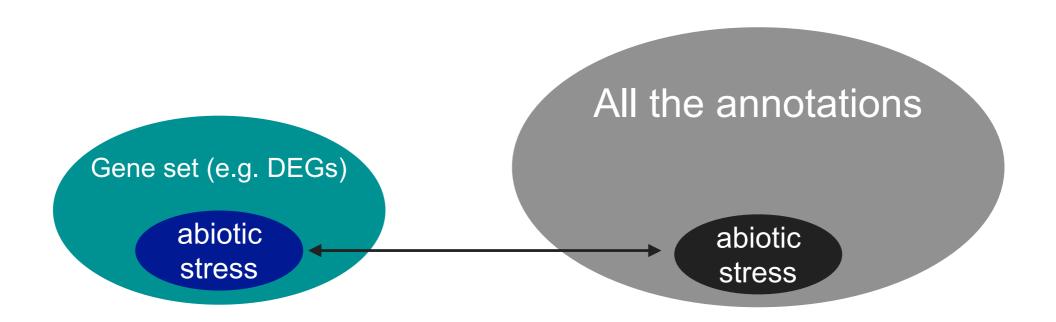


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2. Gene Set Enrichment Analysis

One of the main uses of the GO is to perform enrichment analysis on gene sets. For example, given a set of genes that are up-regulated under certain conditions, an enrichment analysis will find which GO terms are over-represented (or under-represented) using annotations for that gene set.



Is the subgroup proportion significant?



2. Gene Set Enrichment Analysis

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Interpretation:

Background frequency is the number of genes annotated to a GO term in the entire background set.

Sample frequency is the number of genes annotated to that GO term in the input list.

Overrepresented (+) or underrepresented (-)

P-value is the probability or chance of seeing at least x number of genes out of the total n genes in the list annotated to a particular GO term, given the proportion of genes in the whole genome that are annotated to that GO Term.



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3. Tools to analyse GO Terms.

There are different tools to perform a GO term enrichment analysis. Some popular ones such as Blast2GO runs on a standalone software and run these analysis as a part of a bigger pipeline.

Tools can be divided as:

- Web applications.
- Standalone applications.
- R (and other programs) packages.



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3.1. Web based tools

Most of the web tools are quite intuitive but the lack in the flexibility that it is needed to analyse non-model organisms. *The have the "universe" pre-set, so the identifiers should be the same that the gene_ids of these pre-sets*.

Some examples are:

- BINGO (https://www.psb.ugent.be/cbd/papers/BiNGO/Home.html). It is a Javabased tool implemented as a plugin of Cytoscape.
- GeneWeaver (https://www.geneweaver.org/). Web application for the integrated cross-species analysis of functional genomics data from heterogeneous sources.
- gProfiler (http://biit.cs.ut.ee/gprofiler/gost). Web application with ENSEMBL genomes, including several plants.
- Ontologizer (http://ontologizer.de/). It is a Java Webstart application.
- GOrilla (http://cbl-gorilla.cs.technion.ac.il/). Web application with most of the classical models.
- Gene Ontology (http://geneontology.org/).

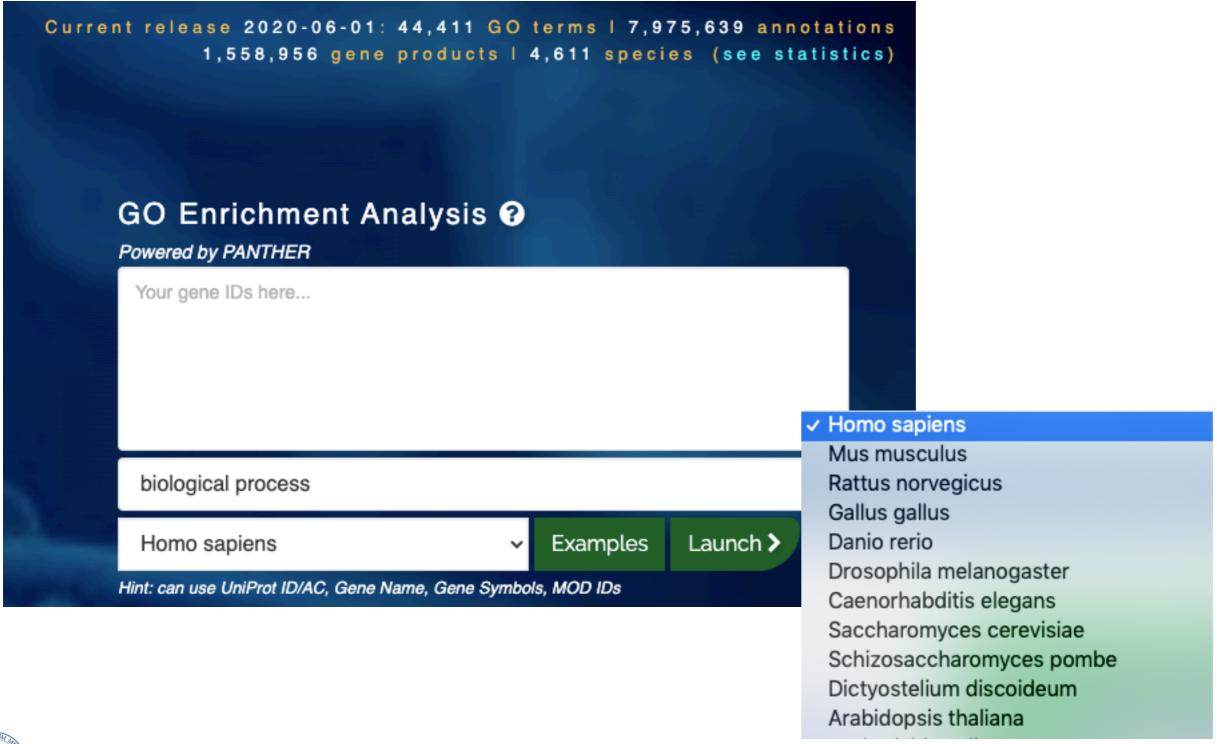


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3.1.1. Gene Ontology

http://geneontology.org/





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3.2.1. **GOrilla**

http://cbl-gorilla.cs.technion.ac.il/



Gene Ontology enRIchment anaLysis and visuaLizAtion tool

GOrilla is a tool for identifying and visualizing enriched GO terms in ranked lists of genes. It can be run in one of two modes:

- 1. Searching for enriched GO terms that appear densely at the top of a ranked list of genes or
- 2. Searching for enriched GO terms in a target list of genes compared to a background list of genes.

For further details see References.

	Running example	<u>Usage instructions</u>	GOrilla News	References	Contact
Step 1: Choose organism					
Homo sapiens Step 2: Choose running mode					
 Single ranked list of genes Two unranked lists of genes (target and bac Step 3: Paste a ranked list of gene/protein names 	ekground lists)				
Names should be separated by an <enter>. The preferred format is gene symbol. Other supported formats are: gene and protein RefSeq, Uniprot, Unigene and Ensembl.</enter>					
Or upload a file: Choose file No file chosen					



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3.2. R packages

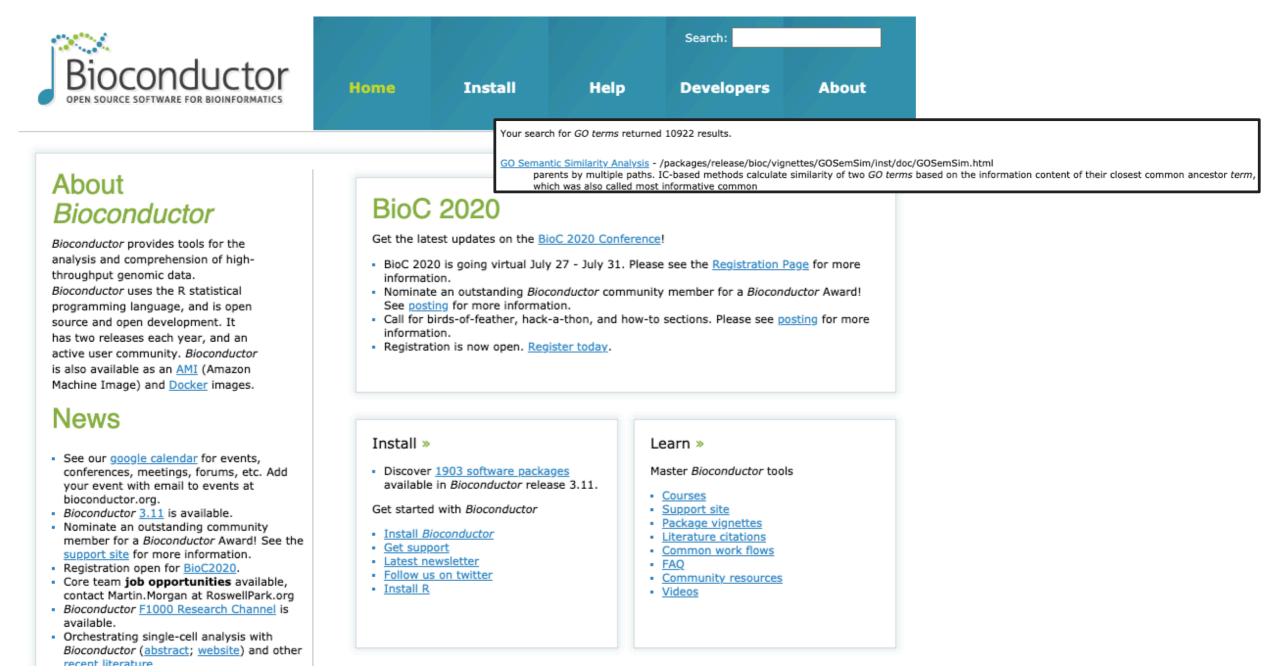
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3.2. R packages

Most of the R packages used for the GO term analysis can be found in Bioconductor.

http://www.bioconductor.org/





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Bioconductor Packages for GO Terms:

GO.db A set of annotation maps describing the entire Gene Ontology

Gostats Tools for manipulating GO and microarrays

GOSim functional similarities between GO terms and gene products

GOProfiles Statistical analysis of functional profiles

TopGO Enrichment analysis for Gene Ontology



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GO.db http://www.bioconductor.org/packages/2.9/data/annotation/html/GO.db.html

A set of annotation maps describing the entire Gene Ontology

1) GO terms stored in **objects**

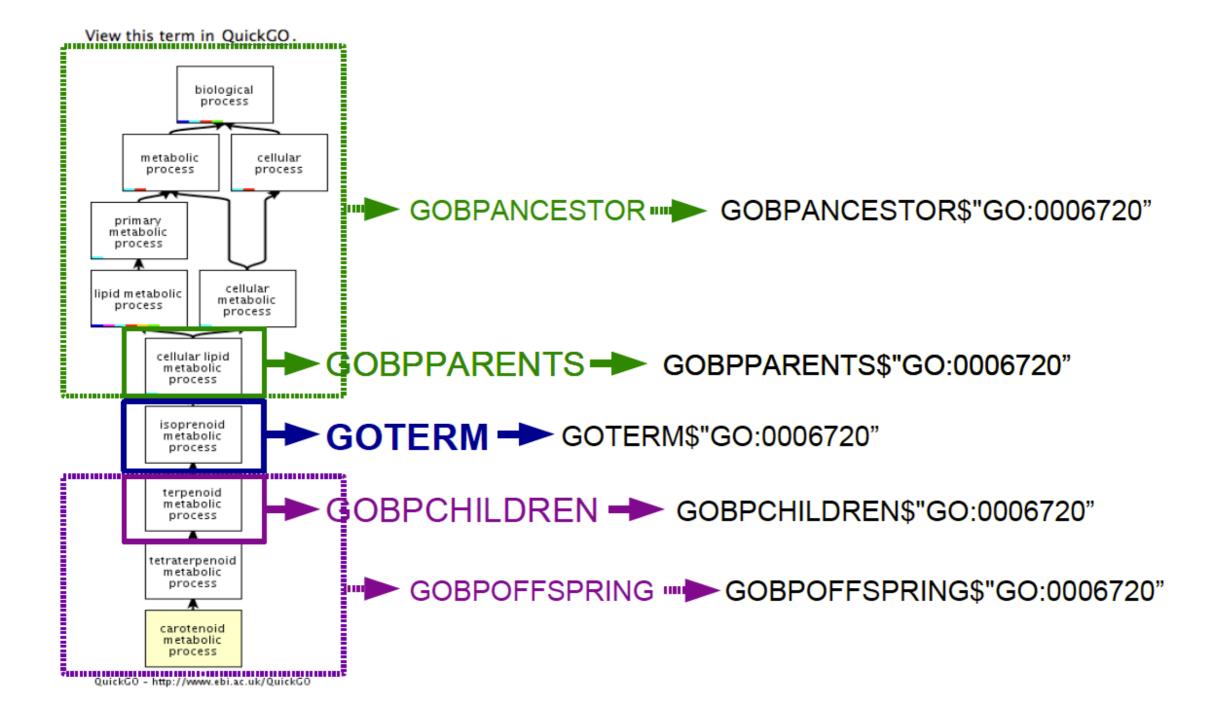
GOTERM,

GOBPPARENTS, GOCCPARENTS, GOMFPARENTS
GOBPANCESTOR, GOCCANCESTOR, GOMFANCESTOR
GOBPCHILDREN, GOCCCHILDREN, GOMFCHILDREN
GOBPOFFSPRING, GOCCOFFSPRING, GOMFOFFSPRING

More Information:

http://www.bioconductor.org/packages/2.6/bioc/vignettes/annotate/inst/doc/GOusage.pdf







Mapping between gene and GO terms stored in objects or dataframes.

Packages

AnnotationData > Organism > Arabidopsis_thaliana

- aq.db aqcdf aqprobe arabidopsis.db0 ath1121501.db ath1121501cdf ath1121501probe
- BSgenome.Athaliana.TAIR.04232008
 BSgenome.Athaliana.TAIR.TAIR9
 hom.At.inp.db
 org.At.tair.db

org.At.tair.db

Genome wide annotation for Arabidopsis, primarily based on mapping using TAIR identifiers.



- 2) Mapping between gene and GO terms stored in **objects** (annotate package) or dataframes.
 - > library("org.At.tair.db")
 - > org.At.tairGO[["AT5G58560"]]

Use a list:

> org.At.tairGO[["AT5G58560"]][[1]]\$Ontology

Functions ("annotate" package):

- + getOntology(inlist, gocategorylist)
- + getEvidence(inlist)
 - > getOntology(org.At.tairGO[["AT5G58560"]])
 - > getEvidence(org.At.tairGO[["AT5G58560"]])



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topGO http://www.bioconductor.org/packages/release/bioc/html/topGO.html

topGO: Enrichment analysis for Gene Ontology

	fisher	ks	t	globaltest	sum
classic	\checkmark	√	\checkmark	√	$\overline{}$
$_{ m elim}$	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
weight	\checkmark				
weight01	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
lea	\checkmark	\checkmark	\checkmark	\checkmark	\checkmark
parentchild	\checkmark				_

Table 1: Algorithms currently supported by topGO.



Different algorithms are adequate only to some specific test

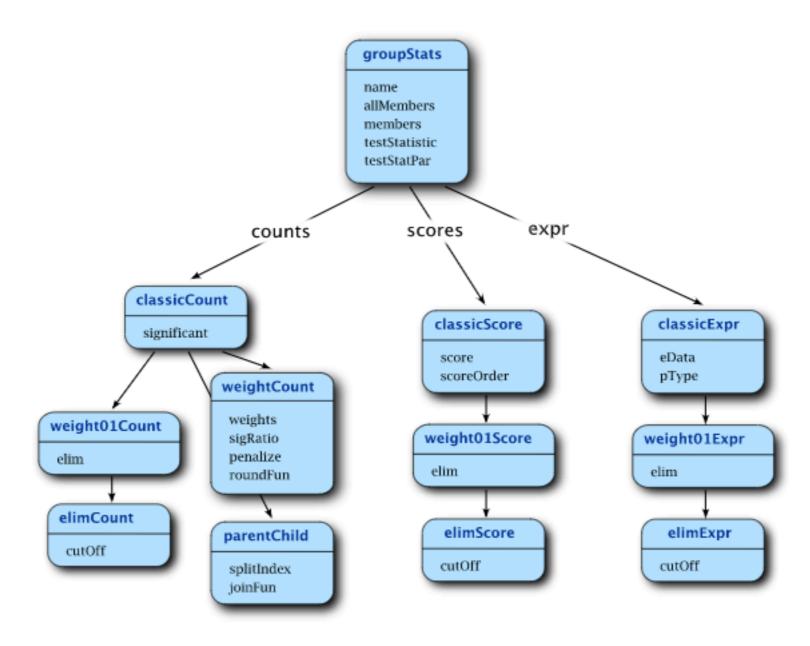
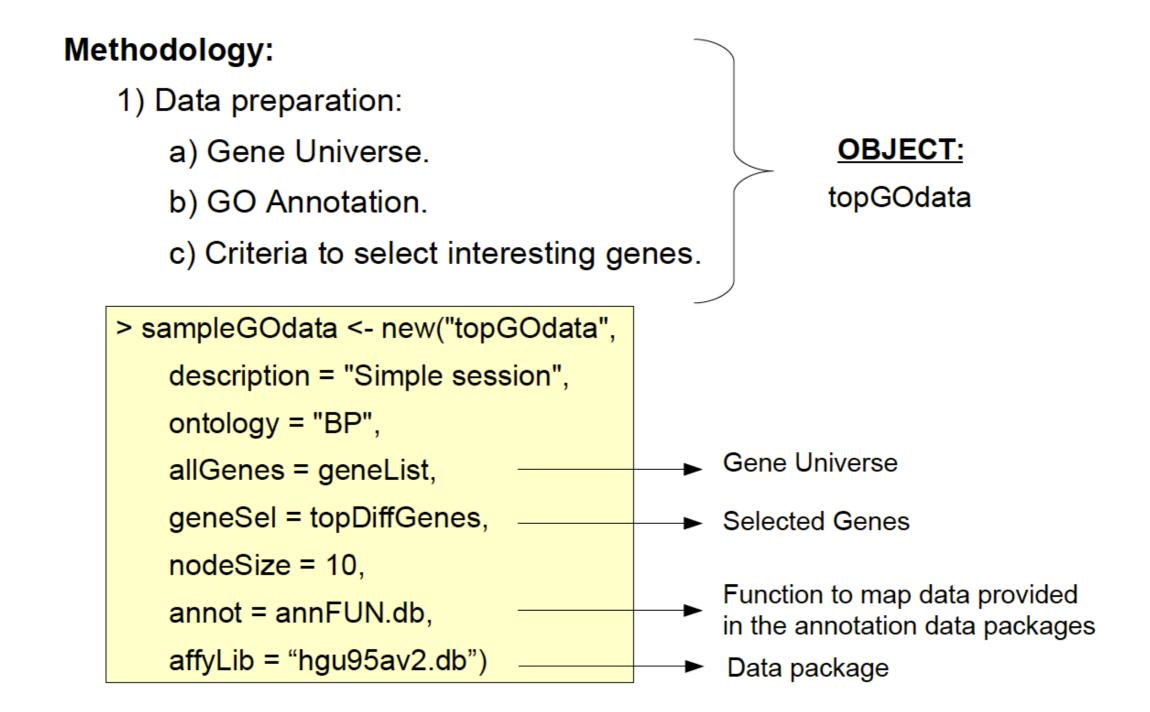


Figure 4: The test statistics class structure.



Different algorithms are adequate only to some specific test

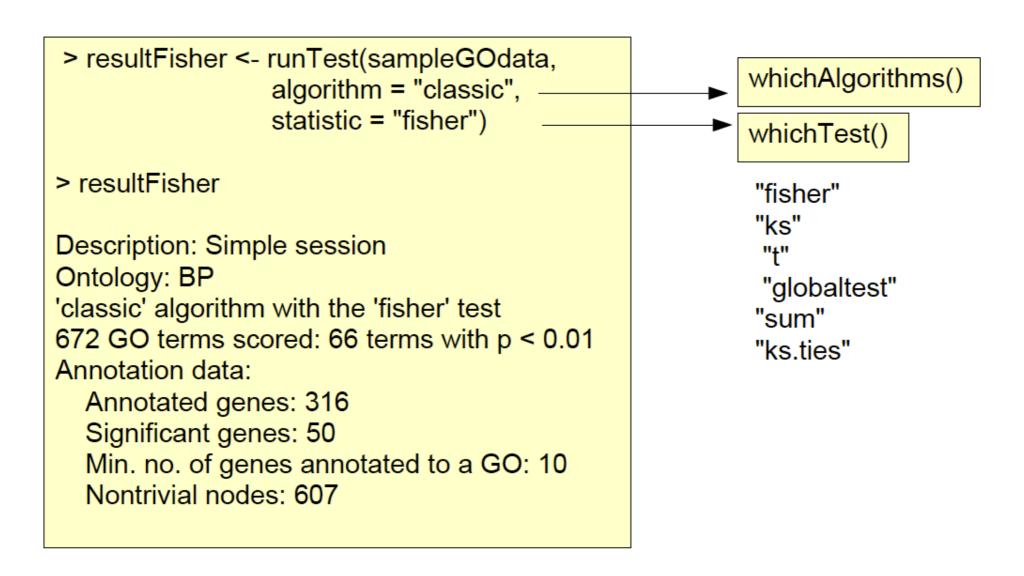




Different algorithms are adequate only to some specific test

Methodology:

2) Running the enrinchment test: (runTest function)





Different algorithms are adequate only to some specific test

Methodology:

3) Analysis of the results: (GenTable function)

	GO.ID	Term	Annotated	Significant	Expected	Rank in classicFisher	classicFisher	classicKS
1	GO:0007049	cell cycle	204	33	32.28	324	0.48	2.8e-11
2	GO:0022403	cell cycle phase	189	28	29.91	435	0.78	8.2e-11
3	GO:0022402	cell cycle process	192	29	30.38	423	0.73	1.5e-10
4	GO:0000278	mitotic cell cycle	191	28	30.22	442	0.81	2.0e-10
5	GO:0000087	M phase of mitotic cell cycle	185	24	29.27	566	0.96	2.9e-10
6	GO:0000279	M phase	185	24	29.27	567	0.96	2.9e-10
7	GO:0000280	nuclear division	176	18	27.85	601	1.00	3.7e-09
8	GO:0007067	mitosis	176	18	27.85	602	1.00	3.7e-09
9	GO:0048285	organelle fission	176	18	27.85	603	1.00	3.7e-09
10	GO:0006996	organelle organization	190	21	30.06	600	1.00	2.1e-08



```
R Command example:
## 1- UPLOAD THE ANNOTATION (UNIVERSE)
geneID2GO <- readMappings(file ="Genes.GOTerms.txt")</pre>
GO2geneID <- inverseList(geneID2GO)
## 2- SELECT THE GROUP OF TARGET GENES
DEG GeneIDList = DEG[DEG$qval < 0.05,2]</pre>
## 3- GENERATE THE GO DATA OBJECT
geneNames = names(geneID2G0)
qeneList = factor(as.integer(geneNames %in% DEG GeneIDList))
names(geneList) = geneNames
GOData4 BP = new("topGOdata", ontology = "BP", allGenes = geneList, annot =
annFUN.gene2GO, gene2GO = geneID2GO)
GOData CC = new("topGOdata", ontology = "CC", allGenes = geneList, annot =
annFUN.gene2GO, gene2GO = geneID2GO)
GOData MF = new("topGOdata", ontology = "MF", allGenes = geneList, annot =
annFUN.gene2GO, gene2GO = geneID2GO)
```

R Command example:

```
## 4- RUN THE TEST

resultFis_IAC_BP <- runTest(GOData4_BP, algorithm = "classic", statistic =
"fisher")

resultKS_IAC_BP <- runTest(GOData4_BP, algorithm = "weight01", statistic =
"fisher")

resultWeight_IAC_BP <- runTest(GOData4_BP, algorithm = "elim", statistic =
"ks")

## 5- PRESENT THE RESULTS INTO A TABLE

allRes_IAC_BP <- GenTable(GOData4_BP, classic = resultFis_IAC_BP, KS =
resultKS_IAC_BP, weight = resultWeight_IAC_BP, orderBy = "weight", ranksOf =
"classic", topNodes = 30)</pre>
```



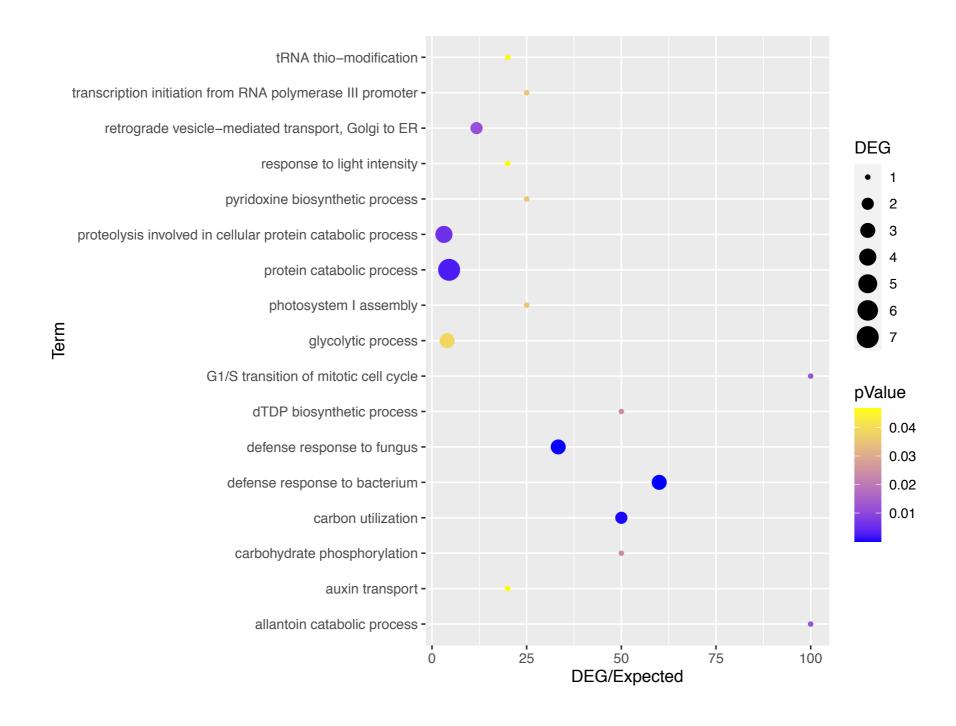
R Command example:

```
## 6- VISUALIZATION (e.g. using GGPLOT)
pVals_Fis_BP = score(resultFis_IAC_BP)[score(resultFis_IAC_BP) <= 0.05]
GOData4DE = termStat(object = GOData4_BP, whichGO = names(pVals_Fis_BP))
GOData4DE$DEG = GOData4DE$Significant
GOData4DE$pValue = pVals_GSEA
GOData4DE$Term = Term(rownames(GOData4DE))
ggplot(GOData4DE, aes(x = DEG/Expected, y = Term)) +
geom_point(aes(color=pValue, size=DEG)) + scale_color_gradient(low="blue", high="yellow")</pre>
```



R Command example:

6- VISUALIZATION (e.g. using GGPLOT)





Outline of Topics

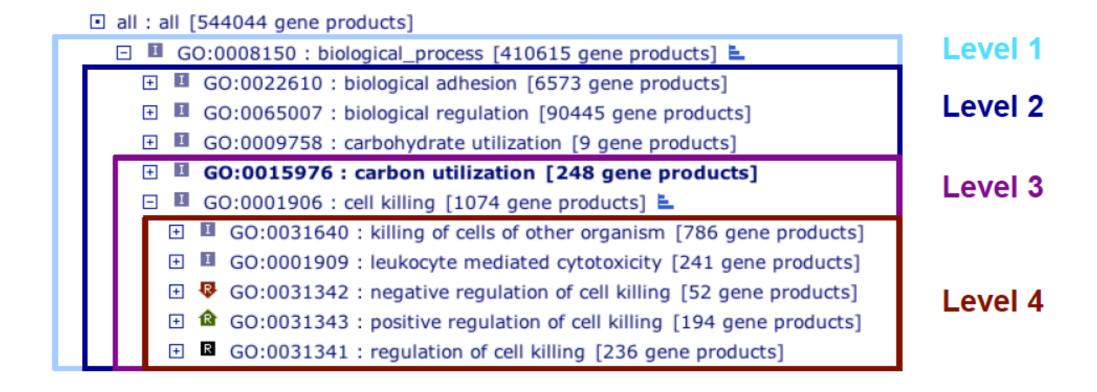
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goProfiles http://www.bioconductor.org/packages/2.8/bioc/html/goProfiles.html

goProfiles: an R package for the statistical analysis of functional profiles

1) Profiles are built by slicing the GO graph at a given level





2) Functional profile at a given GO level is obtained by counting the number of identifiers having a hit in each category of this level

GO Term	genel	gene2	gene 3	gene 4
GO:0005488	1	1	0	0
GO:0030234	0	1	1	1
GO:0045182	0	0	0	1

Table 2.1: A simple list of 4 identifiers considered at level 2 of the MF ontology illustrates how some genes may have hits in several categories simultaneously.

3) Profiles comparissons:

- 1. How different or representative of a given gene universe is a given set of genes?
 - Universe: All genes analyzed,
 - Gene Set: Differentially expressed genes in a microarray experiment
 - Universe: All genes in a database,
 Gene Set: Arbitrarily selected set of genes
- 2. How biologically different are two given sets of genes?
 - Differentially expressed genes in two experiments
 - Arbitrarily chosen lists of genes



Methodology:

- 1) Data preparation:
 - a) Gene GO term map (object or dataframe).

Dataframe with 4 columns:

- + GeneID
- + Ontology
- + Evidence
- + GOID
- 2) Profile creation:
 - a) basicProfile function

```
BasicProfile( genelist, idType = "Entrez", onto = "ANY", Level = 2, orgPackage=NULL, anotPackage=NULL, ...)

"Entrez" (default), "BiocProbes", "GoTermsFrame"

**Requested for "Entrez" Requested for "BiocProbes"
```



Methodology:

- 2) Profile creation:
 - a) basicProfile function

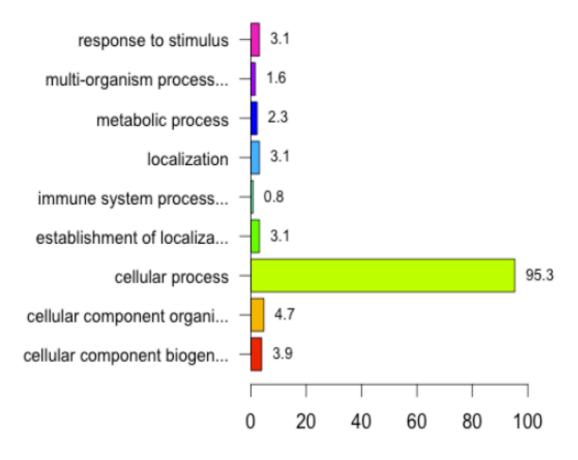
> printProfiles(bpprofile)		
Functional Profile		
============		
[1] "BP ontology"		
Description	GOID	Frequency
25 cellular component biogen	GO:0044085	5
14 cellular component organi	GO:0016043	6
12 cellular process	GO:0009987	122
32 establishment of localiza	GO:0051234	4
4 immune system process	GO:0002376	1
31 localization	GO:0051179	4
2 metabolic process	GO:0008152	3
33 multi-organism process	GO:0051704	2
30 response to stimulus	GO:0050896	4



Methodology:

- 2) Profile creation:
 - a) basicProfile function
 - > plotProfiles(bpprofile)

Functional Profile. BP ontology





Methodology:

- 2) Profile creation:
 - b) **expandedProfile** function
 Used mainly for comparisons of profiles.

- 3) Profile comparisons:
 - Case I (INCLUSION): One list incluided in the other.
 - Case | (DISJOINT): Non overlapping gene sets
 - Case III (INTERSECTION): Overlapping genes



Methodology:

3) Profile comparisons:

Case I (INCLUSION): compareProfilesLists()

- Case || (DISJOINT): compareGeneLists()

- Case III (INTERSECTION): compareGeneLists()

```
> comp_ath_genes <- compareGeneLists(
          genelist1=ath_chl_list,
          genelist2=ath_mit_list,
          idType="Entrez", orgPackage="org.At.tair.db",
          onto="BP", level=2)</pre>
```

> print(compSummary(comp_ath_genes))

Sqr.Euc.Dist StdErr pValue 0.95Cl.low 0.95Cl.up 0.031401 0.024101 0.005000 -0.015837 0.078639



Methodology:

3) Profile comparisons:

```
> basic_mitprof <- basicProfile(ath_mit_list, idType="Entrez",
onto="BP", level=2, orgPackage="org.At.tair.db",
empty.cats=TRUE)
```

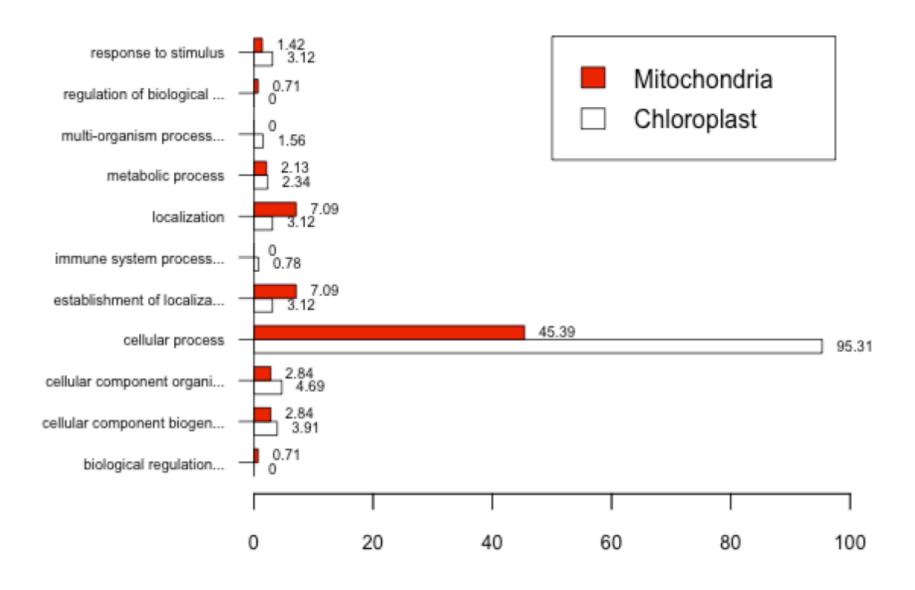
- > basic_chloprof <- basicProfile(ath_chl_list, idType="Entrez", onto="BP", level=2, orgPackage="org.At.tair.db", empty.cats=TRUE)
- > merged_prof <- mergeProfilesLists(basic_chloprof, basic_mitprof, profNames=c("Chloroplast", "Mitochondria"))</p>
- > plotProfiles(merged_prof, percentage=TRUE, legend=TRUE)



Methodology:

3) Profile comparisons:

Functional Profile. BP ontology





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3.2.4. GOSim

GOSim

```
platforms all rank 442 / 1905 posts 0 in Bioc 6.5 years
build ok updated before release dependencies 47
```

DOI: 10.18129/B9.bioc.GOSim

Computation of functional similarities between GO terms and gene products; GO enrichment analysis

Bioconductor version: Release (3.11)

This package implements several functions useful for computing similarities between GO terms and gene products based on their GO annotation. Moreover it allows for computing a GO enrichment analysis

Author: Holger Froehlich <frohlich at bit.uni-bonn.de>

Maintainer: Holger Froehlich <frohlich at bit.uni-bonn.de>

Citation (from within R, enter citation("GOSim")):

Important note to the maintainer of the GOSim package: An error occured while trying to generate the citation from the CITATION file. This typically occurs when the file contains R code that relies on the package to be installed e.g. it contains calls to things like packageVersion() or packageDate() instead of using meta\$Version or meta\$Date. See R documentation for more information.

Installation

To install this package, start R (version "4.0") and enter:

```
if (!requireNamespace("BiocManager", quietly = TRUE))
  install.packages("BiocManager")

BiocManager::install("GOSim")
```

For older versions of R, please refer to the appropriate Bioconductor release.

