# Exploring and Presenting Results

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## Functional enrichment results

- Gene set information
  - Gene set name
  - Gene set source
  - Gene set description
- Statistical information
  - Raw p-value
  - Corrected p-value
  - Enrichment value

- Count information
  - Hit genes in category
  - Hit genes outside category
  - Background genes in category
  - Background genes outside category

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#### Presenting results

#### Tables are a natural way to present the key data

Name	P-value	Adjusted p-value	Z- score	Combined score
glycogen biosynthetic process (GO:0005978)	0.004329	0.5192	-3.53	2.31
maturation of 5.8S rRNA (GO:0000460)	0.02044	0.5192	-2.83	1.85
mitochondrion organization (GO:0007005)	0.007428	0.5192	-2.82	1.85
mitochondrial calcium ion transmembrane transport (GO:0006851)	0.05335	0.5192	-2.57	1.69
generation of precursor metabolites and energy (GO:0006091)	0.001993	0.5192	-2.56	1.68
retinal metabolic process (GO:0042574)	0.01428	0.5192	-2.44	1.60
protein polyubiquitination (GO:0000209)	0.1031	0.5192	-2.32	1.52
protein homotetramerization (GO:0051289)	0.01521	0.5192	-2.28	1.49

## **Graphical Representations**

- Need to add something over a table
  - Relationships between multiple result values
  - Representation of redundancy between categories
  - Relationship to original data
  - Context of surrounding pathway

#### Plotting relationships between values



Category 

Biological Process

Cellular Component

Molecular Function

- P-value (y)
- Enrichment (x)
- Count (radius)
- Redundancy (colour)



http://wencke.github.io/

## Redundancy in gene lists

Gene ontology is hierarchical - a gene is placed in the most specific category and will also appear in all the parent categories



#### Redundancy in gene lists

Most genes are associated with multiple GO terms

There are many annotation sources, not just gene ontologies



Ontology structure is more complex than just parent-child relationships

#### Redundancy: DAVID clustering

40 CI	uster(s)				F	<u>Download File</u>
	Annotation Cluster 1	Enrichment Score: 16.36	G		Count	P_Value Benjamini
	SP_PIR_KEYWORDS	dna-binding	<u>RT</u>		53	3.5E-24 4.5E-22
	GOTERM_BP_FAT	regulation of transcription	<u>RT</u>		60	2.0E-20 1.8E-17
	GOTERM_MF_FAT	DNA binding	<u>RT</u>		54	6.0E-20 7.9E-18
	GOTERM_MF_FAT	transcription regulator activity	<u>RT</u>		45	2.0E-19 1.3E-17
	SP_PIR_KEYWORDS	transcription regulation	<u>RT</u>		49	5.9E-19 3.8E-17
	GOTERM_MF_FAT	sequence-specific DNA binding	<u>RT</u>		30	1.5E-16 4.9E-15
	SP_PIR_KEYWORDS	Transcription	<u>RT</u>		48	8.1E-16 3.3E-14
	GOTERM_BP_FAT	transcription	<u>RT</u>		48	1.9E-15 8.1E-13
	GOTERM_MF_FAT	transcription factor activity	<u>RT</u>		33	2.8E-15 9.1E-14
	SP_PIR_KEYWORDS	nucleus	<u>RT</u>		69	1.1E-14 3.6E-13
	GOTERM_BP_FAT	regulation of RNA metabolic process	<u>RT</u>		40	2.1E-12 6.1E-10
	GOTERM_BP_FAT	regulation of transcription, DNA-dependen	t RT		39	6.4E-12 1.4E-9
	Annotation Cluster 2	Enrichment Score: 10.03	G		Count	P_Value Benjamini
	GOTERM_MF_FAT	sequence-specific DNA binding	<u>RT</u>		30	1.5E-16 4.9E-15
	GOTERM_MF_FAT	transcription factor activity	<u>RT</u>		33	2.8E-15 9.1E-14
	INTERPRO	Homeodomain-related	<u>RT</u>	-	16	2.3E-10 4.3E-8
	INTERPRO	Homeobox	<u>RT</u>	<b>-</b>	15	1.8E-9 1.7E-7
	INTERPRO	Homeobox, conserved site	<u>RT</u>	- <b>-</b>	14	3.4E-9 2.1E-7
	SP_PIR_KEYWORDS	Homeobox	<u>RT</u>	- <b></b>	15	8.5E-9 1.8E-7
	UP_SEQ_FEATURE	DNA-binding region:Homeobox	<u>RT</u>	=	13	2.6E-8 3.7E-6
	SMART	HOX	<u>RT</u>		15	4.7E-8 2.1E-6
	Annotation Cluster 3	Enrichment Score: 5.86	G		Count	P_Value Benjamini
	INTERPRO	<u>Transcription factor, fork head, conserved</u> <u>site</u>	RT	=	7	3.6E-7 1.7E-5
	INTERPRO	Transcription factor, fork head	RT	=	7	3.6E-7 1.7E-5
	UP_SEQ_FEATURE	DNA-binding region:Fork-head	RT	E. 1	7	9.1E-7 6.5E-5
	SMART	<u>FH</u>	RT	E. 10	7	1.8E-6 4.0E-5
	INTERPRO	Winged helix repressor DNA-binding	<u>RT</u>	=	9	2.5E-5 6.6E-4

#### Redundancy: Gorilla GO images



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

#### Redundancy: Gorilla GO images



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

## Redundancy: Enrichr overlap plots



#### Redundancy: REVIGO (from Gorilla)



semantic space X

Hide/show	w dispensable GO terms	Export	results	to text table (CSV)	) 📿 <u>Make (</u>	R script for plotting
term ID	description	frequency	pin?	log <sub>10</sub> p-value	uniqueness	dispensability
GO:0007155	cell adhesion	0.564 %		-7.1618	0.99	0.00
GO:0008150	biological_process	100.000 %		-3.6162	1.00	0.00
GO:0022610	biological adhesion	1.210 %		-7.5986	0.99	0.00
GO:0030198	extracellular matrix organization	0.015 %		-18.6162	0.91	0.00
<u>G0:0043206</u>	extracellular fibril organization	0.000 %	-[=]	-3.1124	0.92	0.83
<u>G0:0022617</u>	extracellular matrix disassembly	0.001 %	-[=]	-8.4921	0.92	0.88
<u>G0:0048251</u>	elastic fiber assembly	0.000 %	-[=]	-3.8861	0.92	0.83
<u>G0:0085029</u>	extracellular matrix assembly	0.001 %	-[=]	- 5. 2993	0.92	0.87
GO:0032501	multicellular organismal process	0.790 %		-9.7595	0.99	0.00
GO:0032502	developmental process	1.387 %		-4.0458	0.99	0.00
GO:0044699	single-organism process	53.975 %		-4.9066	1.00	0.00
GO:0048511	rhythmic process	0.020 %		-3.6757	0.99	0.00

#### http://revigo.irb.hr/

## Redundancy: Giraph (via David)

#### Giraph plot

Proximity of circles is related to the proportion of overlapping genes between categories.

Size of circle represents the number of genes.



https://github.com/laurabiggins/Giraph

## Relationship to original data

- Quantitative values for genes in category
  - Direction and magnitude of change

- Look at genes in category which aren't hits
  - Relative numbers
  - Supportive changes?

#### Relationship to original data





### Pathways: ClueGo

- App within Cytoscape
- ClueGO integrates GO terms as well as pathways
- Creates a functionally organized GO/pathway term network



## Pathways: Reactome



#### Pathways: Reactome



## Summary

- Tables are often sufficient
  - Must include name, enrichment, corrected p-value
  - Other values are useful, but don't put in everything
- Figures can add extra information
  - Plotting multiple metrics
  - Illustrating redundancy
  - Relating to original data
  - Mapping to pathways

