

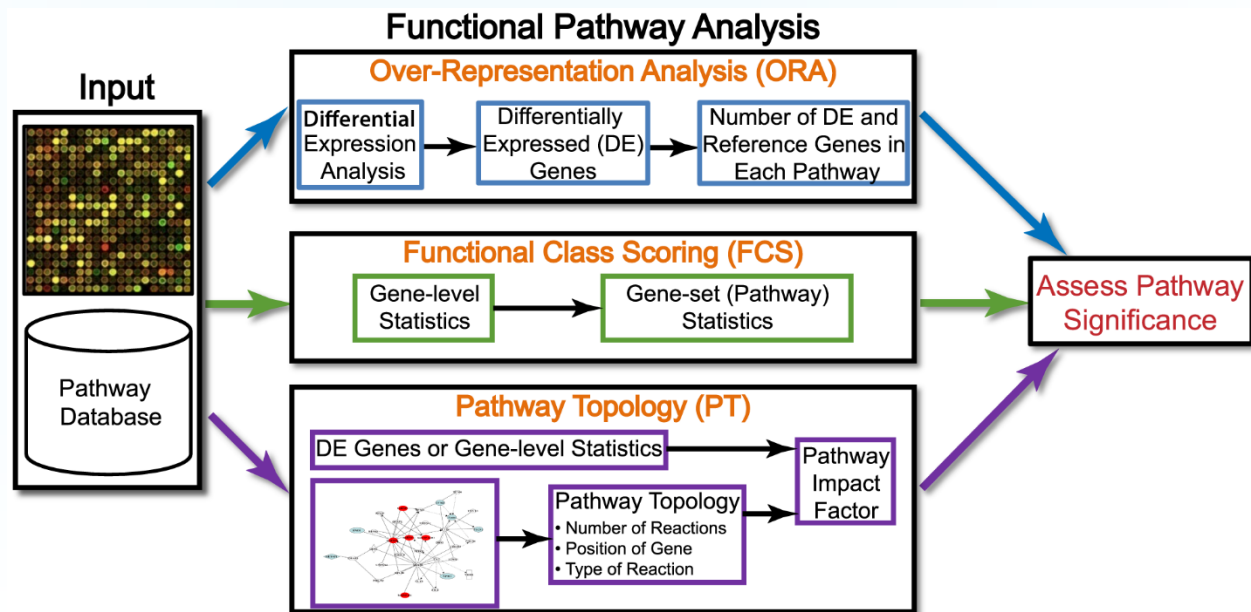
易生信——最懂你的生信培训，学习生信更容易



富集分析

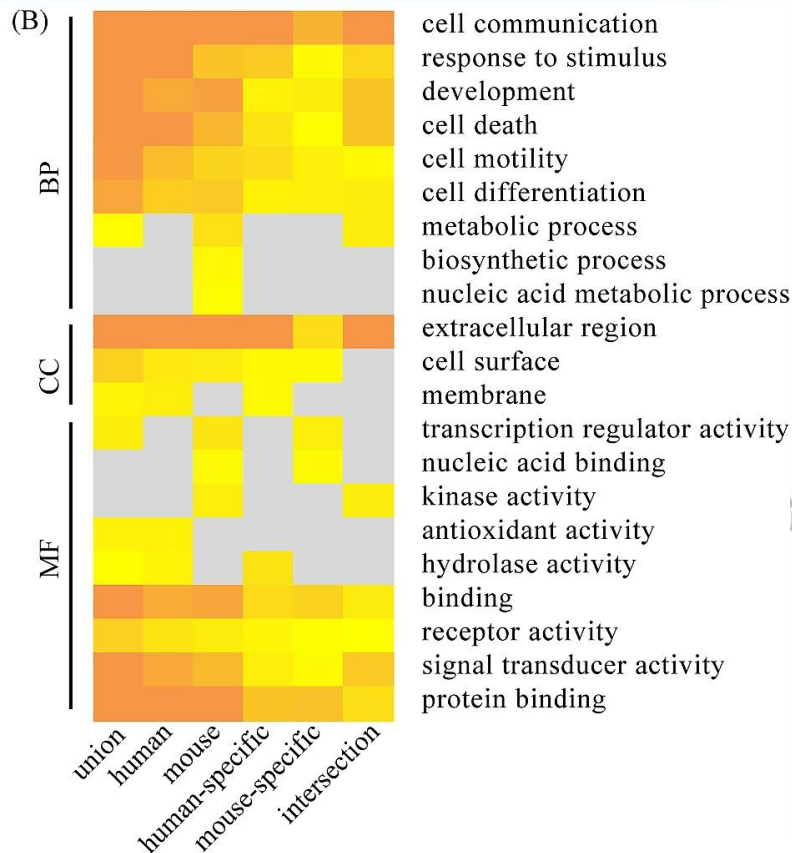
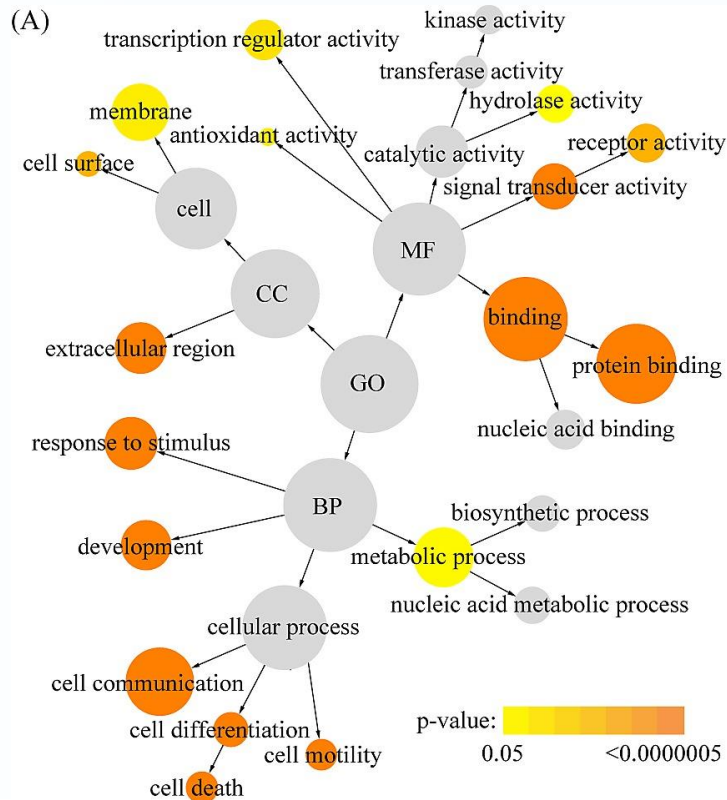
富集分析的意义

- 从数以千计的基因里面查找其倾向参与的调控通路，以指导下一步的研究方向。



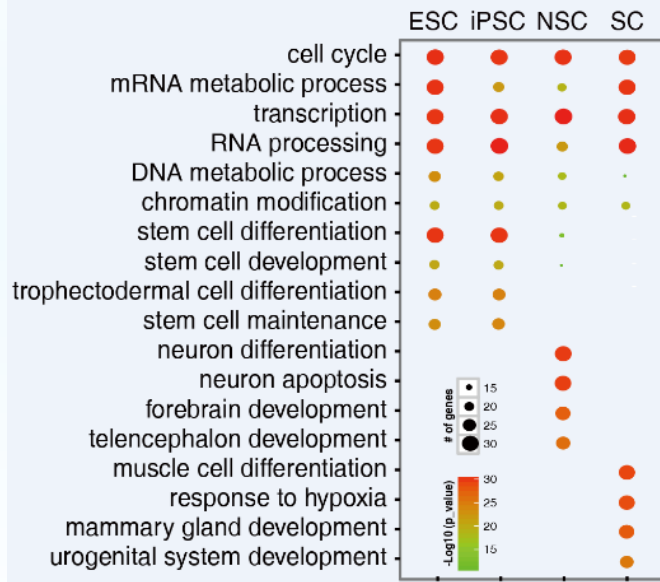
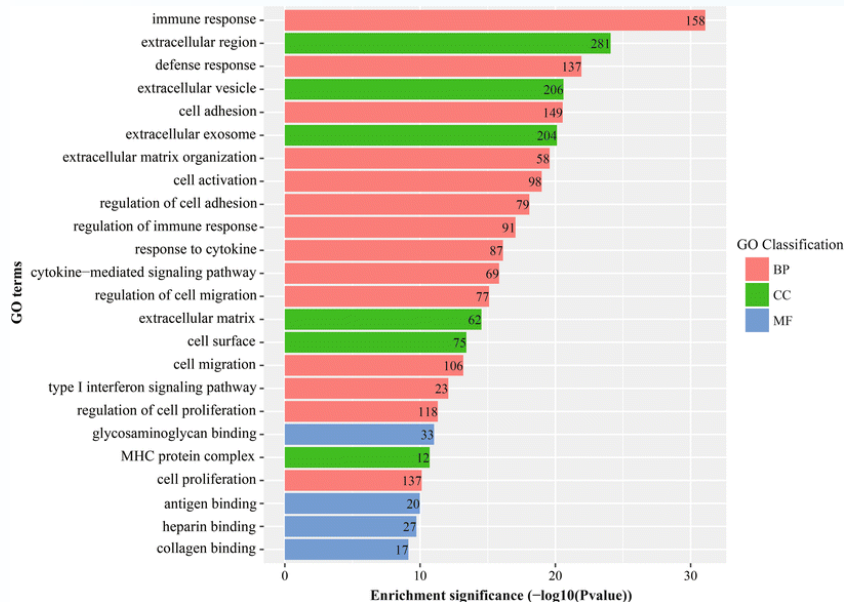
宏基因组

GO富集结果展示



基因组

GO富集结果展示



基因功能富集分析 – GO/KEGG/Reactome

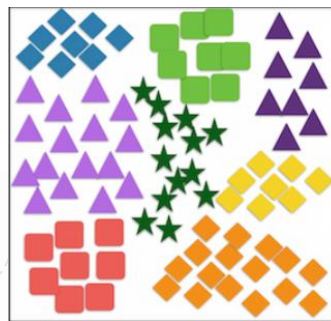
基于筛选的差异基因或其它自己定义的一组基因，采用**超几何检验**判断上调或下调基因在哪些GO或KEGG或其它定义的通路富集。假设背景基因数目为 m ，背景基因中某一通路pathway中注释的基因有 n 个；上调基因有 k 个，上调基因中落于通路pathway的数目为 l 。简单来讲就是比较 l/k 是否显著高于（也可以是低于） n/m ，即上调基因中落在通路pathway的比例是否高于背景基因在这一通路的比例。（实际计算时，是算的 **odds ratio** 的差异， $l/(k-l)$ vs $(n-l)/(m-k-n+l)$ ）。

Enrichment
analysis

GO/GSEA

| | User Genes | Genome |
|----------------|------------|-----------|
| In Pathway | l | $n-l$ |
| Not In Pathway | $k-l$ | $m-k-n+l$ |

Inputs



DEGs
list 1



DEGs
list 2

WGCNA
Cytoscape

Network
analysis

GO富集分析的工具 – GOEAST输入

- 输入基因列表即可(13_salmon_de_go/ehbio_salmon..DESeq2.untrt._lowerThan_.trt.id.xls, 需要id转换)
- 注释数据每周更新

GOEAST News:

2016-07-02: new!

GOEAST server auto update is significantly speeded up, i.e. much shorter maintenance time now.

2019-02-18: new!

Gene Ontology information updated.

2019-02-11: new!

Gene Ontology information updated.

2019-02-04:

Gene Ontology information updated.

Batch Genes

The following steps will guide you through Batch-Genes analysis.
Currently we support 58 species from Mammals and Plants to Fungi and Bacteria.
Different species would require gene identifiers OR gene symbols in different format!
Up to 20000 gene IDs are allowed in a single analysis.

Step one: Choose species

Homo sapiens

Step 2: Select gene ID / Symbol type and format

Please pick out the gene ID / Symbol type and Database format for *Homo sapiens* below:

| | | | |
|------------------------|--|--|---|
| | Gene ID type | <input type="radio"/> Gene ID | <input checked="" type="radio"/> Gene Symbol |
| Database format | <input checked="" type="radio"/> UniProtKB Annotated by: UniProtKB GO Annotation @ EBI (UniProtKB-GOA) Total annotated proteins: 45240 | <input type="radio"/> E. g. A23706, A27926, A2TJX0 | <input type="radio"/> E. g. NARU3, TPPO, KLF5 |

Step 3: Upload your gene list

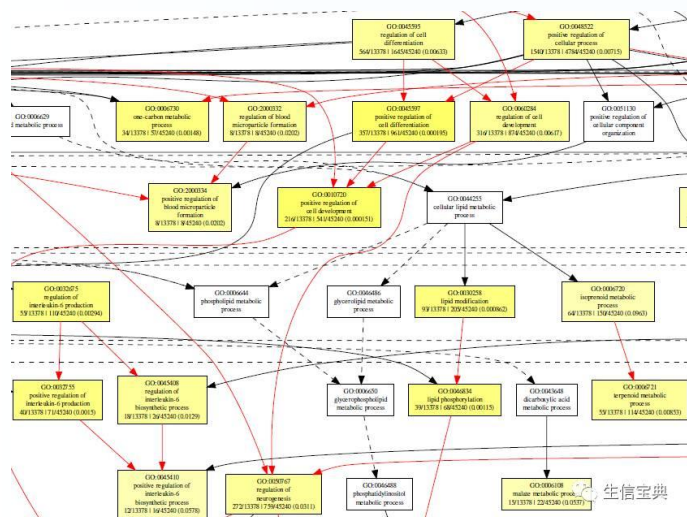
Cut and paste your gene ID / Symbol list below:

SCORD115-36
SCORD115-37
SCORD115-38
SCORD115-39
SCORD115-4
SCORD115-40
SCORD115-41
SCORD115-42
SCORD115-43
SCORD115-44
SCORD115-45

生信宝典

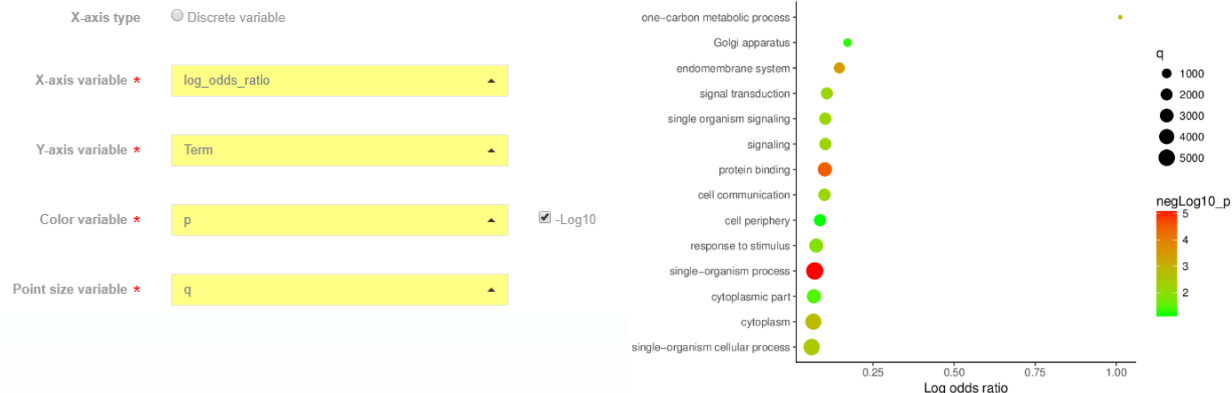


GO富集分析的工具 – GOEAST输出

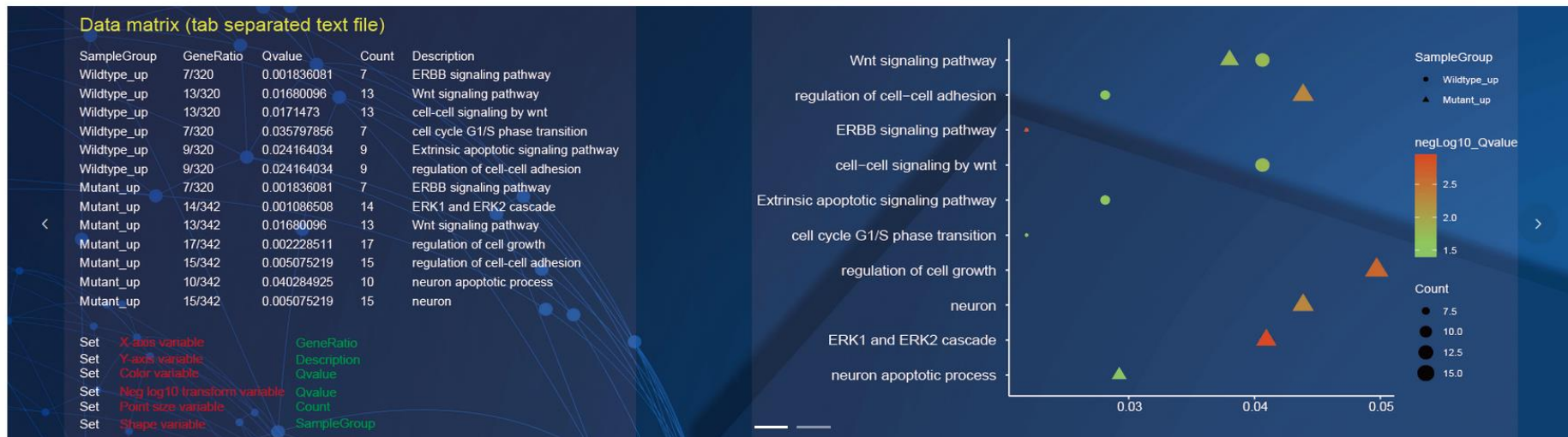


| GOID | Ontology | Term | Level | q | m | t | k | geneIDs | symbols | log_odds | ratio | p |
|------------|--------------------|--|-------|------|-------|-------|-------|--|---------|----------|-------|---|
| GO:0006730 | biological process | one-carbon metabolic process | 1 | 34 | 57 | 45240 | 13378 | C9JZV7 // C9K0S0 // D | | | | |
| GO:0044699 | biological process | single-organism process | 1 | 5781 | 18620 | 45240 | 13378 | C9JZV7 // C9K0S0 // D | | | | |
| GO:0044763 | biological process | single-organism cellular process | 2 | 4988 | 16172 | 45240 | 13378 | C9JZV7 // C9J1Z8 // P84085 // Q16864 | | | | |
| GO:0007154 | biological process | cell communication | 2 | 2169 | 6843 | 45240 | 13378 | C9J1Z8 // P84085 // Q16864 | | | | |
| GO:0007165 | biological process | signal transduction | 5 | 1955 | 6136 | 45240 | 13378 | C9J1Z8 // P84085 // Q16864 | | | | |
| GO:0023052 | biological process | signaling | 1 | 2100 | 6613 | 45240 | 13378 | C9J1Z8 // P84085 // Q16864 // Q9Y1 | | | | |
| GO:0044700 | biological process | single organism signaling | 2 | 2100 | 6613 | 45240 | 13378 | C9J1Z8 // P84085 // Q16864 | | | | |
| GO:0050896 | biological process | response to stimulus | 1 | 3251 | 10438 | 45240 | 13378 | C9J1Z8 // P84085 // Q16864 | | | | |
| GO:0005515 | molecular function | protein binding | 1 | 3299 | 10399 | 45240 | 13378 | P84085 // Q16864 // Q43852 // Q43852 | | | | |
| GO:0005737 | cellular component | cytoplasm | 3 | 4711 | 15220 | 45240 | 13378 | P84085 // Q16864 // H01875 // Q43852 | | | | |
| GO:0005794 | cellular component | Golgi apparatus | 6 | 611 | 1835 | 45240 | 13378 | P84085 // Q43852 // H7C1T7 // Q9UBF2 | | | | |
| GO:0012505 | cellular component | endomembrane system | 2 | 1521 | 4449 | 45240 | 13378 | P84085 // H01875 // Q43852 | | | | |
| GO:0044444 | cellular component | cytoplasmic part | 4 | 3314 | 10694 | 45240 | 13378 | P84085 // Q16864 // H01875 | | | | |
| GO:0071944 | cellular component | cell periphery | 2 | 2059 | 6559 | 45240 | 13378 | P84085 // Q14315 // Q96CM9 // Q16864 | | | | |
| GO:0065008 | biological process | regulation of biological quality | 1 | 1379 | 4097 | 45240 | 13378 | Q16864 // Q16864 | | | | |
| GO:0007166 | biological process | cell surface receptor signaling pathway | 5 | 856 | 2561 | 45240 | 13378 | Q16864 // Q16864 | | | | |
| GO:0007167 | biological process | enzyme linked receptor protein signaling pathway | 5 | 373 | 1007 | 45240 | 13378 | Q16864 // Q16864 | | | | |
| GO:0007169 | biological process | transmembrane receptor protein tyrosine kinase signaling pathway | 5 | 271 | 732 | 45240 | 13378 | Q16864 // Q16864 | | | | |
| GO:0032991 | cellular component | macromolecular complex | 1 | 2221 | 6950 | 45240 | 13378 | Q16864 // F6X838 // H7C1T7 | | | | |
| GO:0043234 | cellular component | protein complex | 1 | 1900 | 5720 | 45240 | 13378 | Q16864 // F6X838 // H7C1T7 | | | | |
| GO:0098796 | cellular component | membrane protein complex | 4 | 595 | 1695 | 45240 | 13378 | Q16864 // F6X838 // H7C1T7 | | | | |
| GO:0005773 | cellular component | vacuole | 5 | 421 | 1132 | 45240 | 13378 | Q16864 // P30048 // Q7L804 // Q01085 // P15133 | | | | |
| GO:0005774 | cellular component | vacuolar membrane | 9 | 242 | 544 | 45240 | 13378 | Q16864 // Q7L804 // P15133 // Q9UBF2 | | | | |
| GO:0031090 | cellular component | organelle membrane | 4 | 909 | 2684 | 45240 | 13378 | Q16864 // C2NX63 // H7C1T7 | | | | |
| GO:0044437 | cellular component | vacuolar part | 7 | 268 | 619 | 45240 | 13378 | Q16864 // Q7L804 // Q16864 | | | | |
| GO:0098588 | cellular component | bounding membrane of organelle | 4 | 638 | 1759 | 45240 | 13378 | Q16864 // H7C1T7 // Q9UBF2 | | | | |
| GO:0098805 | cellular component | whole membrane | 1 | 525 | 1447 | 45240 | 13378 | Q16864 // H7C1T7 // Q9UBF2 // Q000 | | | | |

| GOLD | Ontology Term | Level | q | m | t | k | geneIDs | symbols | log_odds_ratio | p | | |
|--|--------------------|------------------------------|---|---|---|---|---------|---------|----------------|-------|-------|---|
| GO:006730 | biological process | one-carbon metabolic process | | | | | 4 | 34 | 57 | 45240 | 13378 | C9JZV7 / C9K0S0 / D7UEQ7 / F8W7N8 // H0Y8B3 // Q96HN2 // B4DN45 // P31153 // P13995 // E5RFET |
| E5RF612 / E5RG43 / E5RG81 / E5RGU8 // E5RH81 // E5RHP7 // E5RIF9 // E5RIU2 // E5RJE6 // E5RIJ8 // H0YBE2 // P00915 / Q8N1Q1 // P00918 / P07451 // Q9NZL9 // Q9Y2D0 // Q14749 // Q00266 // Q6UB35 // F8W148 // P23280 // P42898 // Q9S5NW | | | | | | | | | | | | |
| MA27B8 // CA55B // GNMT // MATC12 // MTHFD1L // AC6Y // CA6 // MTHFR // MTHFR | | | | | | | | | | | | |
| | | | | | | | | | | | | |
| GO:0044699 | biological process | single-organism process | | | | | 1 | 5781 | 18620 | 45240 | 13378 | C9JZV7 / C9K0S0 // D7UEQ7 // F8W7N8 // H0Y8B3 // Q96HN2 // C9J1Z8 // P84085 // Q16864 // Q43852 // Q9J3Z4 // C9J6R3 // C9J9X8 // C9JXA0 / Q9BYV8 // Q9NX63 // Q14315 // Q9Y5L2 // C9J029 // C9J381 // C9K0R9 // E7EGS0 // H7CS11 // H7CS15 // P20839 // Q13568 // P11599 / Q9UL63 // B4DDV6 // C9P285 // P16656 // P03999 // G3V4Q1 // J3KPG0 // Q43316 // Q9HCM2 // Q00592 // H7C509 // H7C5S9 // Q99835 // Q7KZF4 // Q9ULQ0 // Q9YSL0 // Q86W80 // Q14639 // Q9ULC5 // P08913 // P08588 // Q5VV63 // Q95817 // A8MT70 // Q986Y7 // P55210 // Q5SVL1 // Q5SVL2 // Q6PJP9 // P16690 // Q04743 // A6N174 // A6NNW6 // J3KXN1 // P56159 // Q5VV52 // Q9HLC7 // G8JLE8 // P34947 // P78417 // Q9H4Y5 // Q9Y2H2 // Q74148 // Q9BT63 // P50539 // Q9WY41 // Q53E16 // Q9N6N9 // P16233 // E7EX42 // E9PJCR // E9PM46 // E9PMX6 // E9PR20 // E9PRT6 // H0YDY1 // P54315 // H5F1V6 // P53432 // Q17RR3 // P30408 // P49683 // L07L84 // Q5T481 // Q9ZU13 // Q95940 // Q9UQET // Q95940 // R9WY21 // Q9ULP3 // E2GH20 // H0YE5E // Q5JYR3 // Q5JRY4 // Q5JRY5 // Q5VVR5 // Q5SVY7 // Q5SVR8 // Q9NQ80 // Q9BX74 // Q01085 // Q5SQO9 // Q8DXT5 // H7C2M3 // H7C345 // Q9NUZ1 // F5H6T1 // P61160 // B4DXW4 // F5HP35 // F8WE84 // F8WEW2 // P61158 // Q9J080 // C9J299 // P35612 // P18089 // P15826 // AGNMVY3 // Q8T4CU // Q8N944 // Q9H144 // Q8SGS2 // Q9H6K2 // Q9P525 // Z78XK7 // Q9JB56 // H7HC4P1 // P42331 // EPFEM0 // H0YCT6 // Q9NR80 // C9J100 // Q03989 |



Enrichment plot



Demo1

Demo2

高颜值免费在线绘图平台

ImageGP New

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易生信

Venn 网络展示富集结果

Matrix (two-column mode matrix) ?

Gene_enrichment

| Gene | Pathway |
|--------|-------------|
| CDKN2B | P53_PATHWAY |
| HSPA4L | P53_PATHWAY |
| SDC1 | P53_PATHWAY |
| HMOX1 | P53_PATHWAY |
| RRAD | P53_PATHWAY |
| ZNF365 | P53_PATHWAY |
| SOCS1 | P53_PATHWAY |
| JAG2 | P53_PATHWAY |
| TRIB3 | P53_PATHWAY |
| TNFSF9 | P53_PATHWAY |
| JUN | P53_PATHWAY |
| DAD2B | P53_PATHWAY |

Parameters

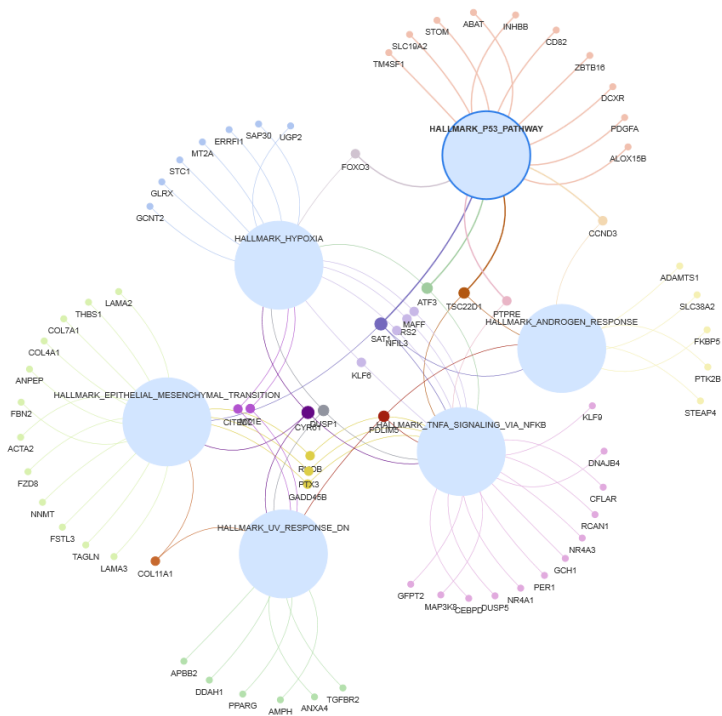
Set colors for each set: ?

+ Open the

Showing mode: ?

☒ Show all elements

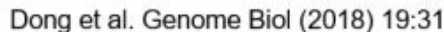
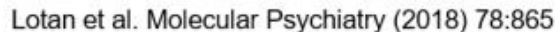
☐ Show only common elements and spe



[工具链接](#)

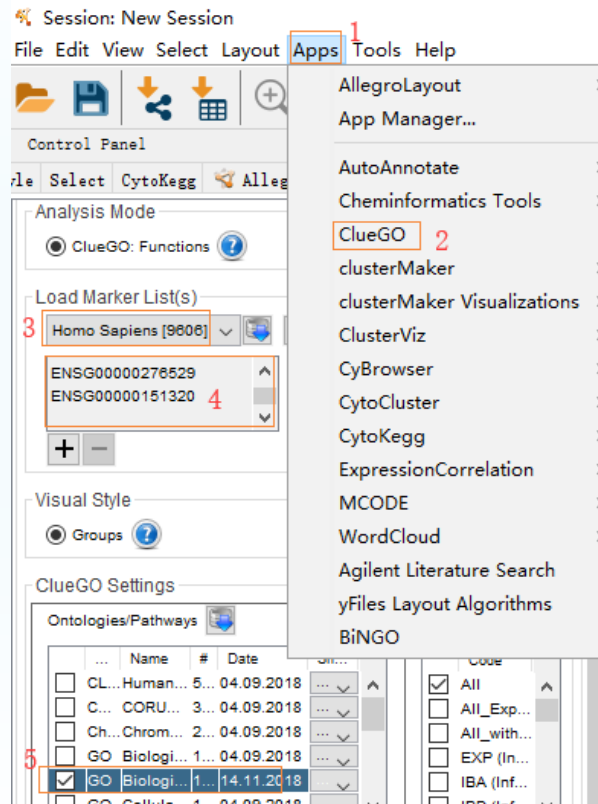
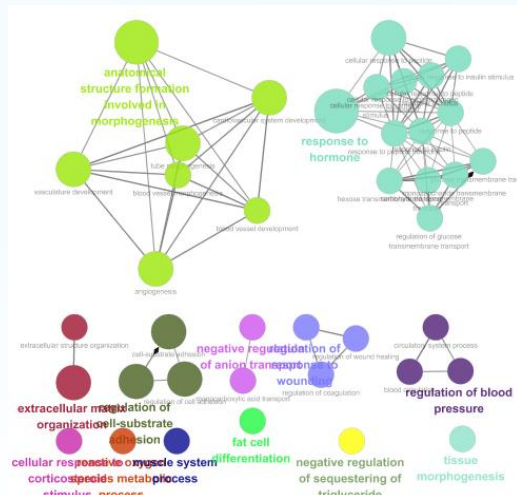
[使用教程](#)



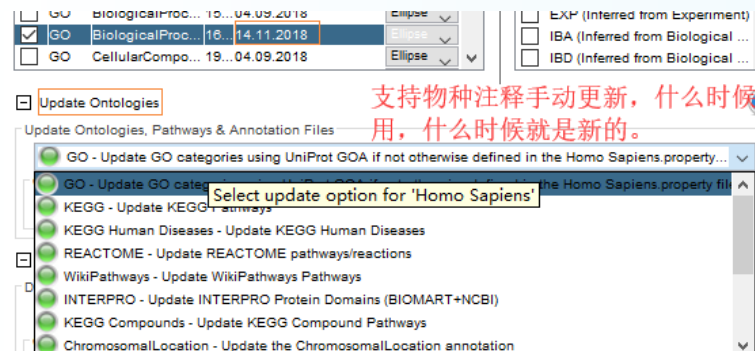
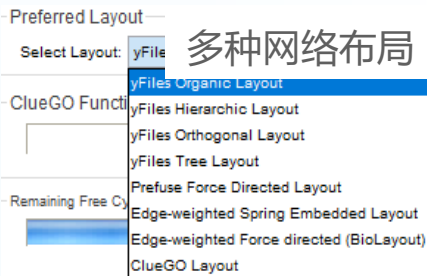
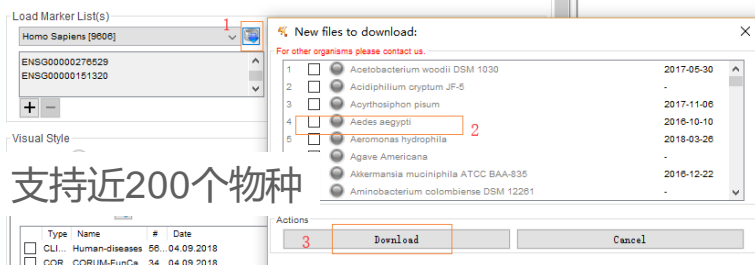


GO富集分析的工具 – clueGO, 操作简单

- 按图示输入基因名字（名字格式支持多种），点Start即可
(clueGo/ehbio_salmon..DESeq2.untrt._lowerThan_.trt.id.xls)

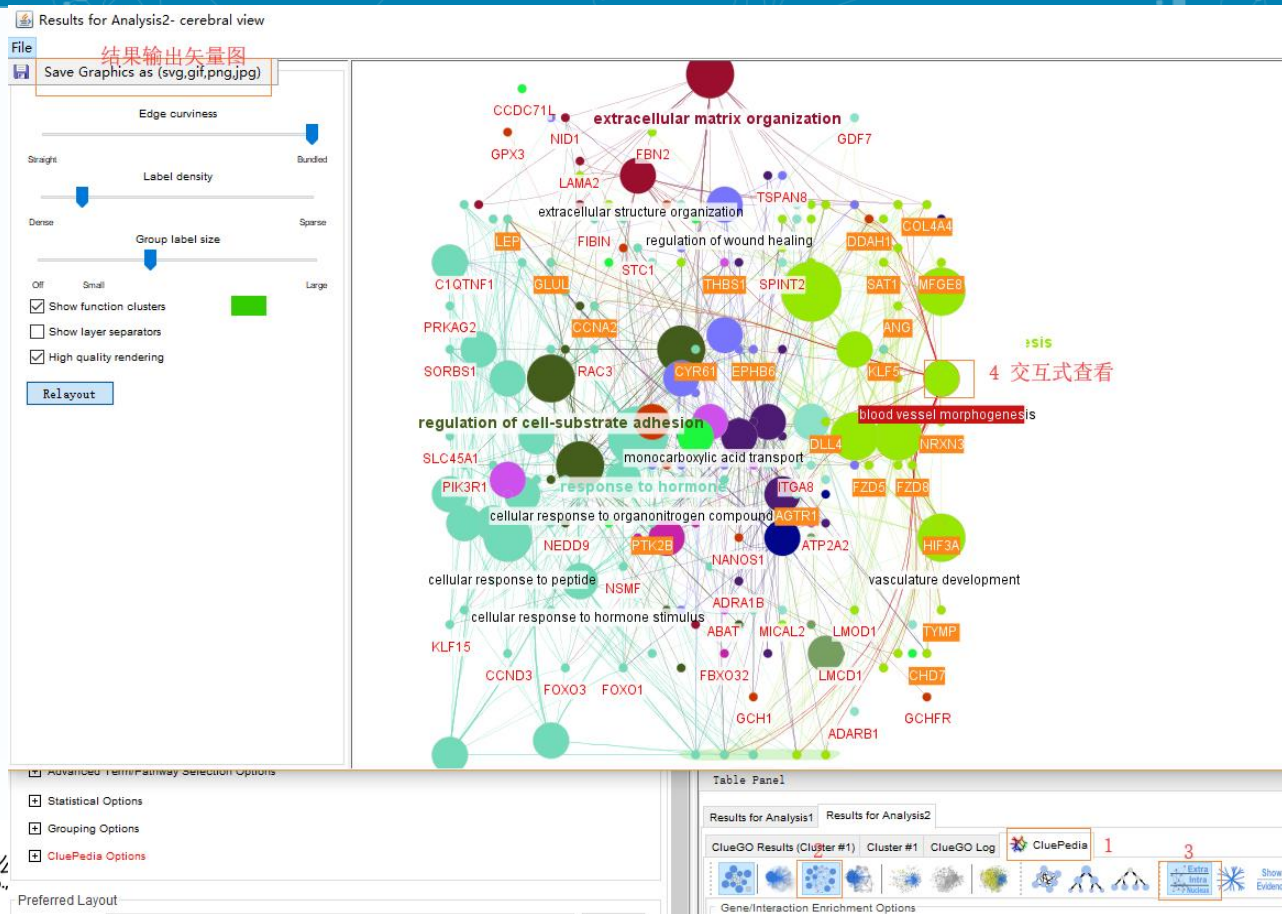


GO富集分析的工具 – clueGO, 更新方便



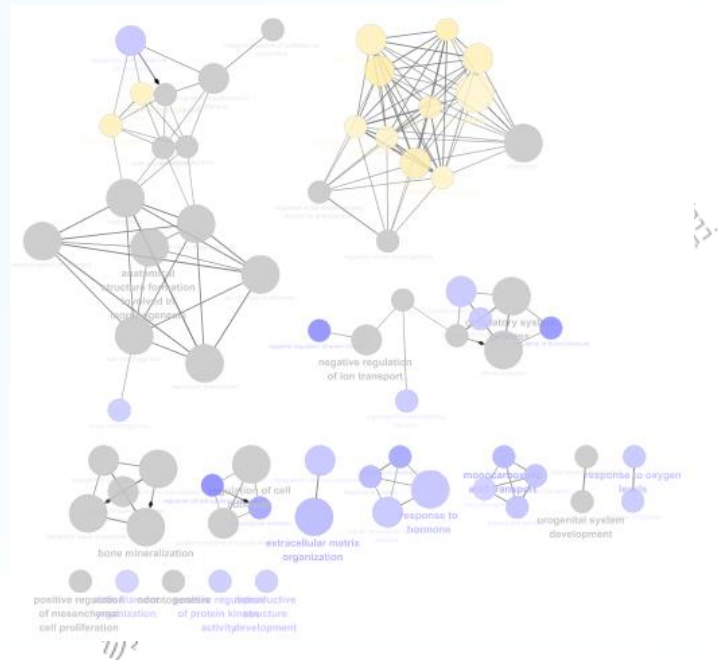
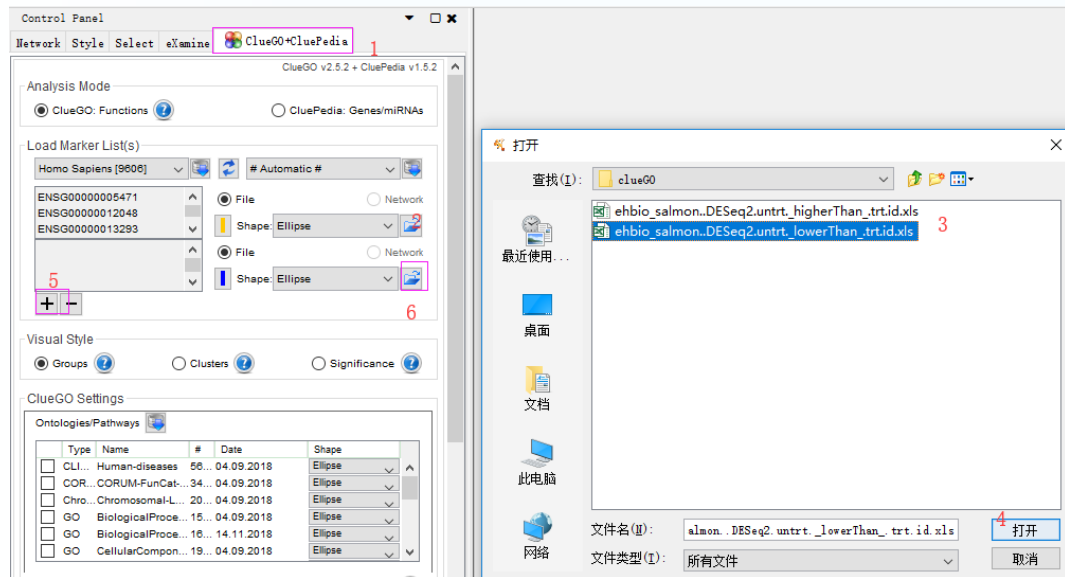
| GOID | GOTerm | Ontology Source | Term PValue | Term PValue Corrected with... | Group PValue |
|-----------|---|-------------------------------|-------------|-------------------------------|--------------|
| GO:001... | negative regulation of sequestering of triglyceride | GO_BiologicalProcess-EBI-U... | 8.0 E-5 | 3.0 E-2 | 8.0 E-5 |
| GO:004... | fat cell differentiation | GO_BiologicalProcess-EBI-U... | 5.0 E-5 | 2.3 E-2 | 5.0 E-5 |
| GO:004... | tissue morphogenesis | GO_BiologicalProcess-EBI-U... | 1.0 E-4 | 4.0 E-2 | 1.0 E-4 |
| GO:000... | muscle system process | GO_BiologicalProcess-EBI-U... | 3.1 E-5 | 1.4 E-2 | 3.1 E-5 |
| GO:007... | cellular response to corticosteroid stimulus | GO_BiologicalProcess-EBI-U... | 5.1 E-5 | 2.3 E-2 | 5.1 E-5 |
| GO:007... | reactive oxygen species metabolic process | GO_BiologicalProcess-EBI-U... | 1.1 E-4 | 4.9 E-2 | 1.1 E-4 |
| GO:190... | negative regulation of anion transport | GO_BiologicalProcess-EBI-U... | 6.0 E-5 | 3.0 E-2 | 6.0 E-5 |

GO富集分析的工具 – clueGO, 交互探索

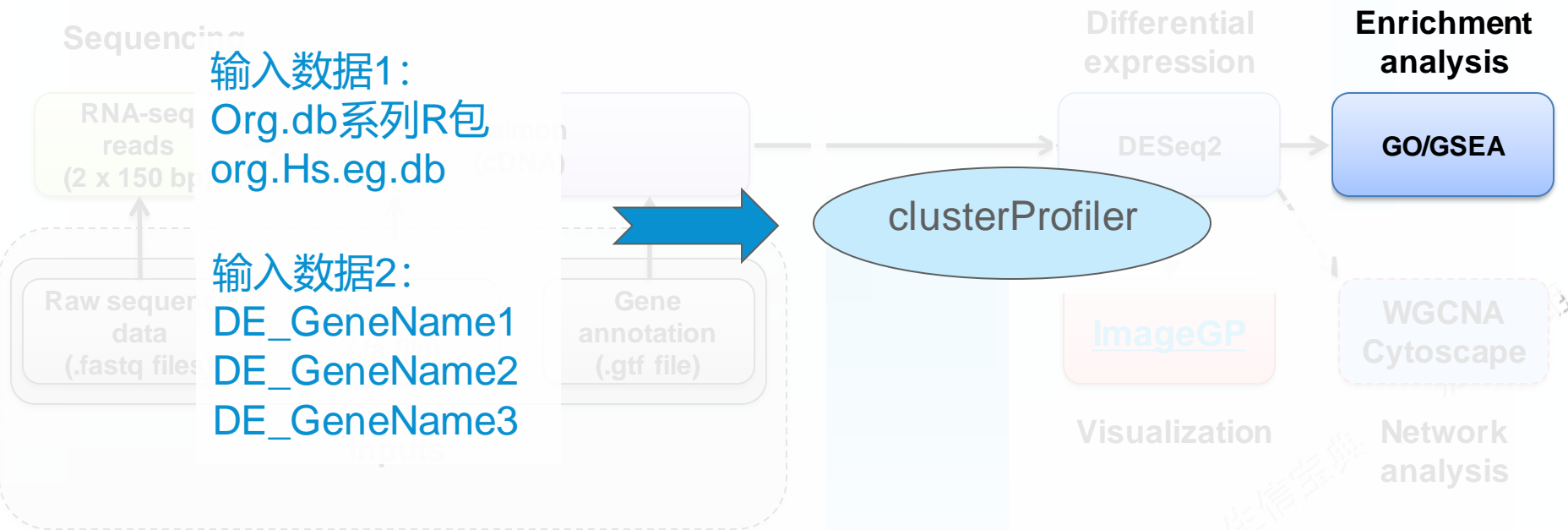


宏基因组

GO富集分析工具 – clueGO, 多个数据集比较



基因功能富集分析 – R包 clusterProfiler

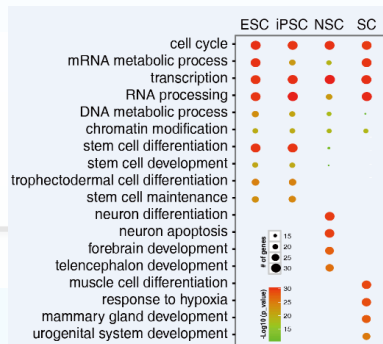


基因功能富集分析

输出结果 (绘制富集分析泡泡图需要哪些列?)

RNA-seq
reads
(2 x 150 bp)

Salmon
(cDNA)

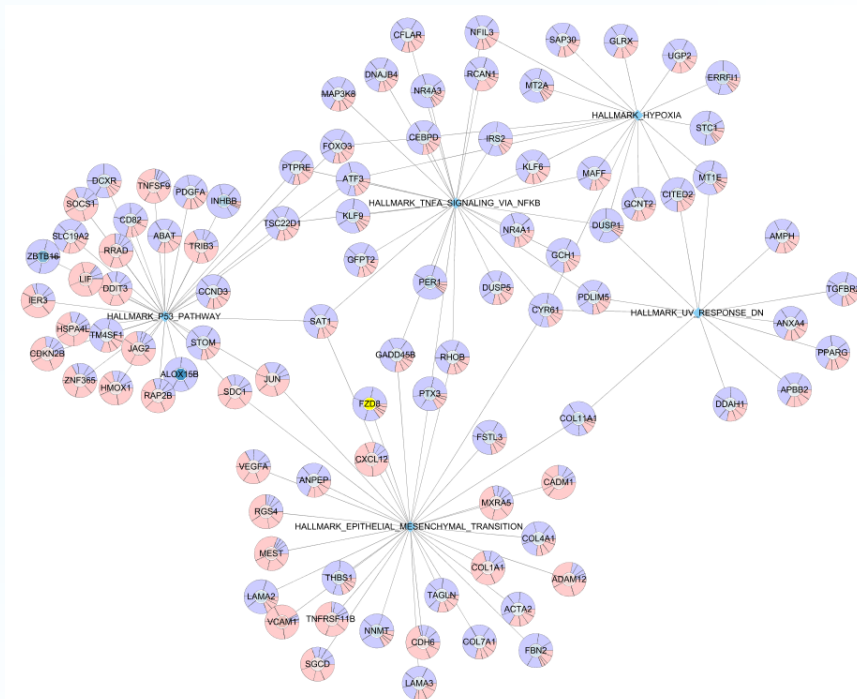
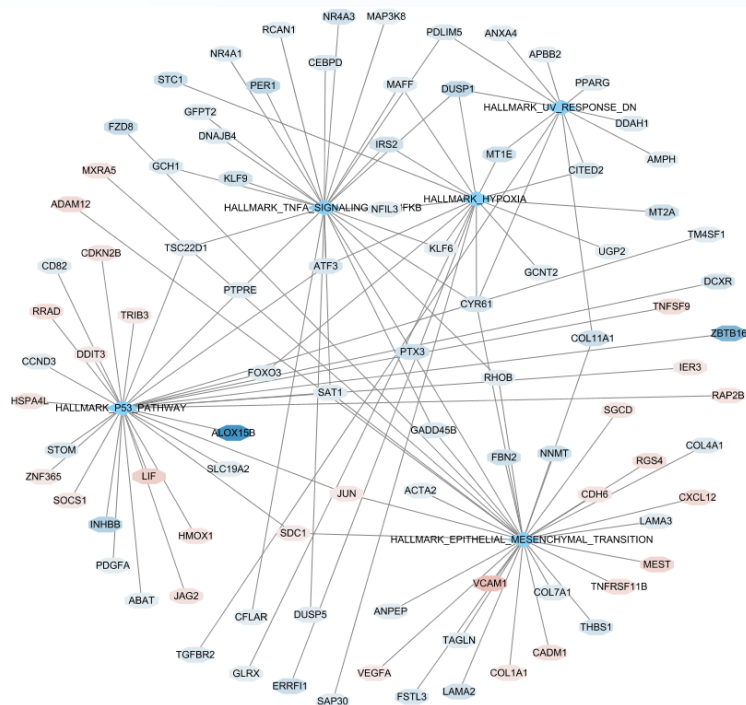


Enrichment
analysis

GO/GSEA

| ID | Description | GeneRatio | BgRatio | pvalue | p.adjust | geneID | Count |
|----------|--------------------------------------|-----------|-----------|----------|-------------|-------------------|-------|
| GO:00481 | blood vessel morphogenesis | 29/380 | 492/16992 | 2.17E-06 | 0.003360933 | FZD8/TGFB2/SAT1 | 29 |
| GO:00301 | extracellular matrix organization | 22/380 | 315/16992 | 2.60E-06 | 0.003360933 | APBB2/CRISPLD2/CI | 22 |
| GO:00431 | extracellular structure organization | 22/380 | 316/16992 | 2.74E-06 | 0.003360933 | APBB2/CRISPLD2/CI | 22 |
| GO:19011 | cellular response to peptide | 21/380 | 320/16992 | 1.15E-05 | 0.008437395 | KLF15/ERRFI1/IRS2 | 21 |
| GO:00451 | fat cell differentiation | 16/380 | 204/16992 | 1.47E-05 | 0.009026139 | ZBTB16/CEBPD/FOX | 16 |
| GO:19011 | organonitrogen compound c | 22/380 | 362/16992 | 2.35E-05 | 0.010478057 | MAOA/SAMHD1/AB | 22 |
| GO:00721 | reactive oxygen species met | 17/380 | 236/16992 | 2.42E-05 | 0.010478057 | GPX3/FOXO3/FOXC | 17 |
| GO:00081 | regulation of blood pressure | 14/380 | 168/16992 | 2.56E-05 | 0.010478057 | ABAT/KCNK6/ADRA | 14 |
| GO:00011 | urogenital system developm | 20/380 | 315/16992 | 2.97E-05 | 0.010942076 | ZBTB16/KLF15/ADA | 20 |

分析结果导入Cytoscape绘制网络图



具体操作见视频：[Cytoscape最新视频教程](#) — [一文学会Cytoscape](#)



分析结果导入Cytoscape绘制网络图

cytoscape/go/ehbio.DESeq2.all.DE.entrez.all.Hallmark.xls.
fornetwork.txt

GO富集分析结果 (网络文件,network)

| ID | geneID |
|----------------------|--------|
| HALLMARK_P53_PATHWAY | CDKN2B |
| HALLMARK_P53_PATHWAY | HSPA4L |
| HALLMARK_P53_PATHWAY | SDC1 |
| HALLMARK_P53_PATHWAY | HMOX1 |
| HALLMARK_P53_PATHWAY | RRAD |
| HALLMARK_P53_PATHWAY | ZNF365 |

cytoscape/go/ehbio.DESeq2.all.DE.entrez.
all.Hallmark.xls.fornetwork.attr

ID类型 (属性文件,table)

| ID | ehbioType | Pathway |
|----------------------|-----------|---------|
| HALLMARK_P53_PATHWAY | | Pathway |
| CDKN2B | Gene | |
| HSPA4L | Gene | |
| SDC1 | Gene | |
| HMOX1 | Gene | |
| RRAD | Gene | |
| ZNF365 | Gene | |
| SOC1 | Gene | |

cytoscape/go/ehbio_salmon.DES
eq2.log2fc_ranked.symbol

基因表达 (属性文件)

| Symbol | log2FoldChange |
|----------------|----------------|
| TBC1D3H | 20.191 |
| BORCS7-ASMT | 20.024 |
| AL669918.1 | 6.611 |
| EEF1E1-BLOC1S5 | 5.894 |
| SLC2A3P1 | 5.844 |
| AC092143.1 | 5.539 |
| AC092647.5 | 5.473 |
| AC107982.1 | 5.401 |
| AC009086.2 | 5.377 |
| LINC00906 | 5.295 |

cytoscape/go/ehbio_salmon.DESeq2.normalized.symbol.txt

基因表达 (属性文件,table,用于绘制环形图)

| id | untrt_N61311 | untrt_N052611 | untrt_N080611 | untrt_N061011 | trt_N61311 | trt_N052611 | trt_N080611 | trt_N061011 |
|---------|------------------|------------------|------------------|------------------|------------------|------------------|------------------|------------------|
| FN1 | 245667.656692696 | 427435.076783868 | 221687.512734298 | 371144.225585293 | 240187.240865362 | 450103.208915937 | 280226.18545873 | 376518.228420769 |
| DCN | 212953.139271322 | 360796.228240728 | 258977.304900524 | 408573.064041333 | 210002.176051172 | 316009.136823338 | 225547.389086547 | 393843.741517662 |
| CEMP | 40996.3399994438 | 137783.098561546 | 53813.9227818064 | 91066.8027335387 | 62301.1248409426 | 223111.851744364 | 212724.837607357 | 157919.470880358 |
| CCDC80 | 137229.15270918 | 232772.172791659 | 86258.132071261 | 212237.323123414 | 136730.761365303 | 226070.893618867 | 124634.556387443 | 236237.808313438 |
| IGFBP5 | 77812.654803177 | 288609.203033488 | 210628.865357085 | 168067.422122145 | 96021.7394882009 | 217439.213375834 | 162677.384733272 | 168387.360789806 |
| COL1A1 | 146450.413011744 | 127367.25201392 | 152281.498327756 | 140861.067252416 | 62358.6411369943 | 53800.4702664978 | 69160.9695135734 | 51044.057104341 |
| GREM1 | 124246.414782713 | 137527.206977703 | 217280.290691803 | 112502.63397527 | 70740.8431693814 | 85790.5487090611 | 255895.396887076 | 63291.6851498017 |
| MT-RNR2 | 63352.8844134643 | 116052.899291032 | 177452.362713352 | 77960.2682345508 | 69491.9895908365 | 124660.170063963 | 146696.670402103 | 81818.4318120244 |
| FTL | 234852.946532585 | 197585.09713336 | 287309.903014121 | 180266.109021257 | 157839.859256742 | 143825.3394449 | 161717.185405949 | 120886.517890885 |
| THBS1 | 37003.7089409061 | 51260.1709570089 | 34506.8160753971 | 36896.2611897521 | 73328.6312858911 | 182993.78531324 | 171753.212688675 | 170443.866045759 |
| COL1A2 | 231083.819966544 | 222832.051447838 | 235896.470203805 | 261359.045589391 | 154771.267200789 | 192284.416295536 | 158748.405656781 | 183571.03362711 |
| COL3A1 | 107753.028584038 | 107063.096741461 | 92552.8083665902 | 117530.436257088 | 66851.7831545688 | 64612.7710105132 | 46012.4185864905 | 60375.2554960024 |
| ACTB | 55781.4419623163 | 70102.1163071557 | 53735.144967013 | 57956.4766940436 | 86717.4766968344 | 121231.813000858 | 147983.126119645 | 96333.806445312 |
| MT-CO1 | 214874.929060859 | 224656.774233706 | 341607.297448607 | 259413.453599984 | 250572.507177251 | 262173.621622476 | 292252.084432335 | 270444.335732747 |
| FTSL1 | 42437.0406844558 | 60334.1747718511 | 41642.5009992771 | 56419.534542056 | 86325.4188546704 | 78378.726713487 | 65956.053254028 | 126447.627675394 |

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