SPIA-PCC: Signaling pathway impact analysis incorporated the change of Pearson correla-tion coefficient between two groups

Xianbin Li 2018-10-18

spiapcc pathway signatures

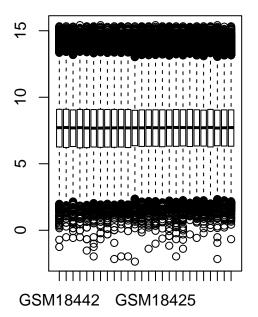
This R package provides function that uses the previous SPIA method and integrate the change of genes Pearson coefficient(PCC) from two groups. We proposed a set of three pathway analysis methods based on the change of PCC. We applied these approaches to colorectal cancer, lung cancer and Alzheimer's disease datasets and so on.

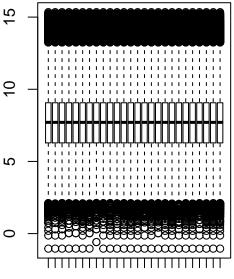
Scoring the KEGGandMetacoreDzPathwaysGEO package data for pathway analysis

This is to outline how to prepare expression data, in this case from the KEGGandMetacoreDzPathwaysGEO package for pathway analysis using spiap.

Preparing the gene expression matrix

```
library(EnrichmentBrowser)
library(KEGGandMetacoreDzPathwaysGEO)
library(KEGGdzPathwaysGEO)
library(SPIA)
# load the dateset
data("GSE1145")
# get the gene expression matrix
exprs_all <- exprs(GSE1145)</pre>
# get the gene symbol of gene expression matrix
all.eset <- probe.2.gene.eset(GSE1145)</pre>
head(featureNames(all.eset))
## [1] "780" "5982" "3310" "7849" "2978" "7318"
# Normalization of gene expression profile
before.norm <- exprs(all.eset)</pre>
all.eset <- normalize(all.eset, norm.method="quantile")</pre>
after.norm <- exprs(all.eset)</pre>
# Change matrix to dataframe style
exprs_all1 <- data.frame(after.norm)</pre>
# plot of normalization
par(mfrow=c(1,2))
boxplot(before.norm)
boxplot(after.norm)
```





GSM18442 GSM18425

Obtaining case and control samples

```
table(pData(all.eset)$Group)

##

## c d

## 11 15

pData(all.eset)$GROUP <- ifelse(pData(all.eset)$Group == "d", 1, 0)
normal <- length(which(pData(all.eset)$GROUP == '0'))
tumor <- length(which(pData(all.eset)$GROUP == '1'))</pre>
```

Get differential expression genes

```
# get differential expression genes
all.eset <- de.ana(all.eset)
head(fData(all.eset), n=4)

## FC ADJ.PVAL limma.STAT
## 780 -0.0662664 0.74712418 -0.5423112
## 5982 -0.3378525 0.01977145 -3.3337793
## 3310 -0.7570934 0.32848640 -1.4348586
## 7849 0.1140257 0.47175743 1.0961393
```

```
all_de <- fData(all.eset)
#The plot of differential expression genes
par(mfrow=c(1,2))
pdistr(fData(all.eset)$ADJ.PVAL)
volcano(fData(all.eset)$FC, fData(all.eset)$ADJ.PVAL)</pre>
```

Volcano Plot P-Value Distribution 0 ∞ 0 ∞ 9 Frequency -log10(p) 9 4 \sim 0 0.6 -2 0 0.2 0.4 8.0 -4 1 2 1.0 log2(foldChange) P-Value

Get database of signaling pathways from KEGG

```
# get pathway dataset
kegg.gs <- get.kegg.genesets("hsa")</pre>
```

Get the results of SPIA method and spiap method, we use colorectal cancer dataset from ${\tt GSE8671}$

```
library(spiapcc)

# get differential expression genes on threshold 0.1

tg <- all_de[all_de$ADJ.PVAL < 0.1,]

# get fold change pf differential expression genes

DE_colorectal = tg$FC

names(DE_colorectal)<-as.vector(rownames(tg))

# get all gene names</pre>
```

```
ALL_colorectal = rownames(all_de)
#The result of spia method
res_spia = spia(de = DE_colorectal, all=ALL_colorectal, organism="hsa",nB=2000,plots=FALSE,beta=NULL,colorectal
##
## Done pathway 1 : RNA transport..
## Done pathway 2 : RNA degradation..
## Done pathway 3 : PPAR signaling pathway..
## Done pathway 4 : Fanconi anemia pathway..
## Done pathway 5 : MAPK signaling pathway...
## Done pathway 6 : ErbB signaling pathway..
## Done pathway 7 : Calcium signaling pathway..
## Done pathway 8 : Cytokine-cytokine receptor int..
## Done pathway 9 : Chemokine signaling pathway...
## Done pathway 10 : NF-kappa B signaling pathway..
## Done pathway 11 : Phosphatidylinositol signaling..
## Done pathway 12 : Neuroactive ligand-receptor in..
## Done pathway 13 : Cell cycle..
## Done pathway 14 : Oocyte meiosis..
## Done pathway 15 : p53 signaling pathway..
## Done pathway 16 : Sulfur relay system..
## Done pathway 17 : SNARE interactions in vesicula..
## Done pathway 18: Regulation of autophagy..
## Done pathway 19 : Protein processing in endoplas..
## Done pathway 20 : Lysosome..
## Done pathway 21 : mTOR signaling pathway..
## Done pathway 22 : Apoptosis..
## Done pathway 23 : Vascular smooth muscle contrac..
## Done pathway 24 : Wnt signaling pathway..
## Done pathway 25 : Dorso-ventral axis formation..
## Done pathway 26 : Notch signaling pathway..
## Done pathway 27 : Hedgehog signaling pathway..
## Done pathway 28 : TGF-beta signaling pathway...
## Done pathway 29 : Axon guidance..
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## Done pathway 40 : Toll-like receptor signaling p..
## Done pathway 41 : NOD-like receptor signaling pa..
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## Done pathway 45 : Natural killer cell mediated c..
## Done pathway 46 : T cell receptor signaling path..
## Done pathway 47 : B cell receptor signaling path..
## Done pathway 48 : Fc epsilon RI signaling pathwa..
## Done pathway 49 : Fc gamma R-mediated phagocytos..
```

```
## Done pathway 50 : Leukocyte transendothelial mig..
## Done pathway 51 : Intestinal immune network for ..
## Done pathway 52 : Circadian rhythm - mammal..
## Done pathway 53 : Long-term potentiation..
## Done pathway 54 : Neurotrophin signaling pathway..
## Done pathway 55 : Retrograde endocannabinoid sig..
## Done pathway 56 : Glutamatergic synapse..
## Done pathway 57 : Cholinergic synapse..
## Done pathway 58 : Serotonergic synapse..
## Done pathway 59 : GABAergic synapse..
## Done pathway 60 : Dopaminergic synapse..
## Done pathway 61 : Long-term depression..
## Done pathway 62 : Olfactory transduction..
## Done pathway 63 : Taste transduction..
## Done pathway 64 : Phototransduction..
## Done pathway 65 : Regulation of actin cytoskelet..
## Done pathway 66 : Insulin signaling pathway..
## Done pathway 67 : GnRH signaling pathway...
## Done pathway 68 : Progesterone-mediated oocyte m..
## Done pathway 69 : Melanogenesis..
## Done pathway 70 : Adipocytokine signaling pathwa..
## Done pathway 71 : Type II diabetes mellitus..
## Done pathway 72 : Type I diabetes mellitus..
## Done pathway 73 : Maturity onset diabetes of the..
## Done pathway 74 : Aldosterone-regulated sodium r..
## Done pathway 75 : Endocrine and other factor-reg..
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## Done pathway 79 : Pancreatic secretion..
## Done pathway 80 : Carbohydrate digestion and abs..
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## Done pathway 82 : Mineral absorption..
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## Done pathway 84 : Parkinson's disease..
## Done pathway 85 : Amyotrophic lateral sclerosis ...
## Done pathway 86 : Huntington's disease..
## Done pathway 87 : Prion diseases...
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## Done pathway 100 : Leishmaniasis..
## Done pathway 101 : Chagas disease (American trypa...
## Done pathway 102 : African trypanosomiasis..
## Done pathway 103 : Malaria..
```

```
## Done pathway 104 : Toxoplasmosis..
## Done pathway 105 : Amoebiasis...
## Done pathway 106 : Staphylococcus aureus infectio..
## Done pathway 107 : Tuberculosis..
## Done pathway 108 : Hepatitis C..
## Done pathway 109 : Measles..
## Done pathway 110 : Influenza A..
## Done pathway 111 : HTLV-I infection..
## Done pathway 112 : Herpes simplex infection..
## Done pathway 113 : Epstein-Barr virus infection..
## Done pathway 114 : Pathways in cancer..
## Done pathway 115 : Transcriptional misregulation ...
## Done pathway 116 : Viral carcinogenesis..
## Done pathway 117 : Colorectal cancer..
## Done pathway 118 : Renal cell carcinoma..
## Done pathway 119 : Pancreatic cancer..
## Done pathway 120 : Endometrial cancer..
## Done pathway 121 : Glioma...
## Done pathway 122 : Prostate cancer..
## Done pathway 123 : Thyroid cancer...
## Done pathway 124 : Basal cell carcinoma..
## Done pathway 125 : Melanoma..
## Done pathway 126 : Bladder cancer..
## Done pathway 127 : Chronic myeloid leukemia..
## Done pathway 128 : Acute myeloid leukemia...
## Done pathway 129 : Small cell lung cancer..
## Done pathway 130 : Non-small cell lung cancer..
## Done pathway 131 : Asthma..
## Done pathway 132 : Autoimmune thyroid disease..
## Done pathway 133 : Systemic lupus erythematosus..
## Done pathway 134 : Rheumatoid arthritis..
## Done pathway 135 : Allograft rejection..
## Done pathway 136 : Graft-versus-host disease..
## Done pathway 137 : Arrhythmogenic right ventricul..
## Done pathway 138 : Dilated cardiomyopathy...
## Done pathway 139 : Viral myocarditis...
res_spia <- res_spia[,-12]
head(res_spia)
##
                                          Name
                                                   ID pSize NDE
                                                                        pNDE
## 1
                          Huntington's disease 05016
                                                       178 76 8.083864e-06
                           Alzheimer's disease 05010
                                                       164 70 1.826593e-05
## 3 Chagas disease (American trypanosomiasis) 05142
                                                        102 45 2.177596e-04
## 4
                      ECM-receptor interaction 04512
                                                        85
                                                             33 1.485504e-02
## 5
                                       Malaria 05144
                                                        50
                                                             24 1.539524e-03
## 6
                                    Amoebiasis 05146
                                                        106 43 2.341983e-03
             tA pPERT
                                рG
                                        pGFdr
                                                  pGFWER
                                                             Status
## 1 -0.3699900 0.821 0.0000857672 0.01085692 0.01175011 Inhibited
## 2 1.4164091 0.708 0.0001584953 0.01085692 0.02171385 Activated
## 3 -0.4637171 0.942 0.0019470630 0.06751252 0.26674763 Inhibited
## 4 7.1971982 0.014 0.0019711685 0.06751252 0.27005008 Activated
## 5 -1.1799883 0.199 0.0027850850 0.07631133 0.38155665 Inhibited
## 6 -3.5320157 0.185 0.0037885538 0.08650531 0.51903187 Inhibited
```

```
gse_madat2 <- exprs_all1
# The results of spia nt method
res_nt = spiapcc(de=DE_colorectal, all=ALL_colorectal, normal = normal, tumor = tumor, gse_madat2 = gse_nterior = tumor, gse_madat2 = tumor, gse_madat
                                   beta=NULL,combine="fisher",verbose=T, flag = 1)
##
## Done pathway 1 : RNA transport..
## Done pathway 2 : RNA degradation..
## Done pathway 3 : PPAR signaling pathway..
## Done pathway 4 : Fanconi anemia pathway..
## Done pathway 5 : MAPK signaling pathway..
## Done pathway 6 : ErbB signaling pathway..
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## Done pathway 28 : TGF-beta signaling pathway...
## Done pathway 29 : Axon guidance..
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## Done pathway 46 : T cell receptor signaling path..
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```

```
## Done pathway 48 : Fc epsilon RI signaling pathwa..
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## Done pathway 50 : Leukocyte transendothelial mig..
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```

```
## Done pathway 102 : African trypanosomiasis..
## Done pathway 103 : Malaria..
## Done pathway 104 : Toxoplasmosis...
## Done pathway 105 : Amoebiasis...
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## Done pathway 108 : Hepatitis C..
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## Done pathway 137 : Arrhythmogenic right ventricul..
## Done pathway 138 : Dilated cardiomyopathy...
## Done pathway 139 : Viral myocarditis...
res_nt <- res_nt[,-12]
head(res nt)
##
                                                   ID pSize NDE
                                          Name
                                                                        pNDE
                          Huntington's disease 05016
## 1
                                                       178 76 8.083864e-06
## 2
                           Alzheimer's disease 05010
                                                        164 70 1.826593e-05
                                       Malaria 05144
                                                        50
                                                             24 1.539524e-03
## 4 Chagas disease (American trypanosomiasis) 05142
                                                        102 45 2.177596e-04
                Neurotrophin signaling pathway 04722
                                                        120
                                                             49 1.026966e-03
## 6
                      ECM-receptor interaction 04512
                                                        85
                                                             33 1.485504e-02
##
              tA pPERT
                                 pG
                                         pGFdr
                                                    pGFWER
                                                              Status
## 1 0.01743747 0.956 9.869372e-05 0.01120103 0.01371843 Activated
## 2 0.29422231 0.721 1.611659e-04 0.01120103 0.02240205 Activated
## 3 0.65849958 0.060 9.504738e-04 0.04347802 0.13211586 Activated
## 4 -0.50339814 0.720 1.530338e-03 0.04347802 0.21271700 Inhibited
## 5 1.72720784 0.203 1.975438e-03 0.04347802 0.27458583 Activated
```

```
#The results of spia_tn method
res tn = spiapcc( de=DE colorectal, all=ALL colorectal, normal = normal, tumor = tumor, gse madat2 = gse
                   beta=NULL,combine="fisher",verbose=T, flag = -1)
##
## Done pathway 1 : RNA transport..
## Done pathway 2 : RNA degradation..
## Done pathway 3 : PPAR signaling pathway..
## Done pathway 4 : Fanconi anemia pathway..
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## Done pathway 49 : Fc gamma R-mediated phagocytos..
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```

```
## Done pathway 103 : Malaria..
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res_tn <- res_tn[,-12]
head(res_tn)
##
                                                   ID pSize NDE
                                          Name
                                                                        pNDE
## 1
                          Huntington's disease 05016
                                                        178
                                                            76 8.083864e-06
## 2
                           Alzheimer's disease 05010
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## 3
                                       Malaria 05144
                                                        50 24 1.539524e-03
## 4 Chagas disease (American trypanosomiasis) 05142
                                                        102 45 2.177596e-04
                Neurotrophin signaling pathway 04722
                                                        120
                                                             49 1.026966e-03
## 6
                      ECM-receptor interaction 04512
                                                         85
                                                             33 1.485504e-02
##
              tA pPERT
                                 рG
                                         pGFdr
                                                    pGFWER
## 1 0.01743747 0.956 9.869372e-05 0.01120103 0.01371843 Activated
## 2 0.29422231 0.721 1.611659e-04 0.01120103 0.02240205 Activated
## 3 0.65849958 0.060 9.504738e-04 0.04347802 0.13211586 Activated
## 4 -0.50339814 0.720 1.530338e-03 0.04347802 0.21271700 Inhibited
## 5 1.72720784 0.203 1.975438e-03 0.04347802 0.27458583 Activated
## 6 1.44392628 0.017 2.344530e-03 0.04347802 0.32588972 Activated
```

```
#The results of spia_abs method
res_abs = spiapcc( de=DE_colorectal, all=ALL_colorectal, normal = normal, tumor = tumor, gse_madat2 = gs
                   beta=NULL,combine="fisher",verbose=T, flag = 0)
##
## Done pathway 1 : RNA transport..
## Done pathway 2 : RNA degradation..
## Done pathway 3 : PPAR signaling pathway..
## Done pathway 4 : Fanconi anemia pathway..
## Done pathway 5 : MAPK signaling pathway..
## Done pathway 6 : ErbB signaling pathway..
## Done pathway 7 : Calcium signaling pathway..
## Done pathway 8 : Cytokine-cytokine receptor int..
## Done pathway 9 : Chemokine signaling pathway..
## Done pathway 10 : NF-kappa B signaling pathway...
## Done pathway 11 : Phosphatidylinositol signaling..
## Done pathway 12 : Neuroactive ligand-receptor in..
## Done pathway 13 : Cell cycle..
## Done pathway 14 : Oocyte meiosis..
## Done pathway 15 : p53 signaling pathway..
## Done pathway 16 : Sulfur relay system..
## Done pathway 17 : SNARE interactions in vesicula..
## Done pathway 18: Regulation of autophagy...
## Done pathway 19 : Protein processing in endoplas..
## Done pathway 20 : Lysosome..
## Done pathway 21 : mTOR signaling pathway...
## Done pathway 22 : Apoptosis..
## Done pathway 23 : Vascular smooth muscle contrac..
## Done pathway 24 : Wnt signaling pathway..
## Done pathway 25 : Dorso-ventral axis formation..
## Done pathway 26 : Notch signaling pathway..
## Done pathway 27 : Hedgehog signaling pathway...
## Done pathway 28 : TGF-beta signaling pathway...
## Done pathway 29 : Axon guidance..
## Done pathway 30 : VEGF signaling pathway...
## Done pathway 31 : Osteoclast differentiation..
## Done pathway 32 : Focal adhesion..
## Done pathway 33 : ECM-receptor interaction..
## Done pathway 34 : Cell adhesion molecules (CAMs)..
## Done pathway 35 : Adherens junction..
## Done pathway 36 : Tight junction..
## Done pathway 37 : Gap junction..
## Done pathway 38 : Complement and coagulation cas..
## Done pathway 39 : Antigen processing and present..
## Done pathway 40 : Toll-like receptor signaling p..
## Done pathway 41 : NOD-like receptor signaling pa..
## Done pathway 42 : RIG-I-like receptor signaling ...
## Done pathway 43 : Cytosolic DNA-sensing pathway..
## Done pathway 44 : Jak-STAT signaling pathway..
## Done pathway 45 : Natural killer cell mediated c..
## Done pathway 46 : T cell receptor signaling path..
## Done pathway 47 : B cell receptor signaling path..
## Done pathway 48 : Fc epsilon RI signaling pathwa..
## Done pathway 49 : Fc gamma R-mediated phagocytos..
```

```
## Done pathway 50 : Leukocyte transendothelial mig..
## Done pathway 51 : Intestinal immune network for ..
## Done pathway 52 : Circadian rhythm - mammal..
## Done pathway 53 : Long-term potentiation..
## Done pathway 54 : Neurotrophin signaling pathway..
## Done pathway 55 : Retrograde endocannabinoid sig..
## Done pathway 56 : Glutamatergic synapse..
## Done pathway 57 : Cholinergic synapse..
## Done pathway 58 : Serotonergic synapse..
## Done pathway 59 : GABAergic synapse..
## Done pathway 60 : Dopaminergic synapse..
## Done pathway 61 : Long-term depression..
## Done pathway 62 : Olfactory transduction..
## Done pathway 63 : Taste transduction..
## Done pathway 64 : Phototransduction..
## Done pathway 65 : Regulation of actin cytoskelet..
## Done pathway 66 : Insulin signaling pathway..
## Done pathway 67 : GnRH signaling pathway...
## Done pathway 68 : Progesterone-mediated oocyte m..
## Done pathway 69 : Melanogenesis..
## Done pathway 70 : Adipocytokine signaling pathwa..
## Done pathway 71 : Type II diabetes mellitus..
## Done pathway 72 : Type I diabetes mellitus..
## Done pathway 73 : Maturity onset diabetes of the..
## Done pathway 74 : Aldosterone-regulated sodium r..
## Done pathway 75 : Endocrine and other factor-reg..
## Done pathway 76 : Vasopressin-regulated water re..
## Done pathway 77 : Salivary secretion..
## Done pathway 78 : Gastric acid secretion..
## Done pathway 79 : Pancreatic secretion..
## Done pathway 80 : Carbohydrate digestion and abs..
## Done pathway 81 : Bile secretion..
## Done pathway 82 : Mineral absorption..
## Done pathway 83 : Alzheimer's disease..
## Done pathway 84 : Parkinson's disease..
## Done pathway 85 : Amyotrophic lateral sclerosis ...
## Done pathway 86 : Huntington's disease..
## Done pathway 87 : Prion diseases...
## Done pathway 88 : Cocaine addiction..
## Done pathway 89 : Amphetamine addiction..
## Done pathway 90 : Morphine addiction..
## Done pathway 91 : Alcoholism..
## Done pathway 92 : Bacterial invasion of epitheli..
## Done pathway 93 : Vibrio cholerae infection..
## Done pathway 94 : Epithelial cell signaling in H..
## Done pathway 95 : Pathogenic Escherichia coli in..
## Done pathway 96 : Shigellosis..
## Done pathway 97 : Salmonella infection..
## Done pathway 98 : Pertussis..
## Done pathway 99 : Legionellosis..
## Done pathway 100 : Leishmaniasis..
## Done pathway 101 : Chagas disease (American trypa...
## Done pathway 102 : African trypanosomiasis..
## Done pathway 103 : Malaria..
```

```
## Done pathway 104 : Toxoplasmosis..
## Done pathway 105 : Amoebiasis...
## Done pathway 106 : Staphylococcus aureus infectio..
## Done pathway 107 : Tuberculosis..
## Done pathway 108 : Hepatitis C..
## Done pathway 109 : Measles..
## Done pathway 110 : Influenza A..
## Done pathway 111 : HTLV-I infection..
## Done pathway 112 : Herpes simplex infection..
## Done pathway 113 : Epstein-Barr virus infection..
## Done pathway 114 : Pathways in cancer..
## Done pathway 115 : Transcriptional misregulation ...
## Done pathway 116 : Viral carcinogenesis..
## Done pathway 117 : Colorectal cancer..
## Done pathway 118 : Renal cell carcinoma..
## Done pathway 119 : Pancreatic cancer..
## Done pathway 120 : Endometrial cancer..
## Done pathway 121 : Glioma...
## Done pathway 122 : Prostate cancer..
## Done pathway 123 : Thyroid cancer...
## Done pathway 124 : Basal cell carcinoma..
## Done pathway 125 : Melanoma..
## Done pathway 126 : Bladder cancer..
## Done pathway 127 : Chronic myeloid leukemia..
## Done pathway 128 : Acute myeloid leukemia..
## Done pathway 129 : Small cell lung cancer..
## Done pathway 130 : Non-small cell lung cancer..
## Done pathway 131 : Asthma..
## Done pathway 132 : Autoimmune thyroid disease..
## Done pathway 133 : Systemic lupus erythematosus..
## Done pathway 134 : Rheumatoid arthritis..
## Done pathway 135 : Allograft rejection..
## Done pathway 136 : Graft-versus-host disease..
## Done pathway 137 : Arrhythmogenic right ventricul..
## Done pathway 138 : Dilated cardiomyopathy...
## Done pathway 139 : Viral myocarditis...
res_abs <- res_abs[,-12]
head(res_abs)
##
                                          Name
                                                   ID pSize NDE
                                                                        pNDE
## 1
                          Huntington's disease 05016
                                                        178
                                                            76 8.083864e-06
## 2
                           Alzheimer's disease 05010
                                                        164 70 1.826593e-05
## 3 Chagas disease (American trypanosomiasis) 05142
                                                        102 45 2.177596e-04
                Neurotrophin signaling pathway 04722
## 4
                                                        120
                                                             49 1.026966e-03
        Bacterial invasion of epithelial cells 05100
## 5
                                                         70
                                                             25 8.068118e-02
## 6
                                                            33 1.485504e-02
                      ECM-receptor interaction 04512
                                                         85
                                 рG
                                          pGFdr
                                                    pGFWER
              tA pPERT
## 1 0.03239039 0.971 0.0001001201 0.008879475 0.01391669 Activated
## 2 0.54172743 0.560 0.0001277622 0.008879475 0.01775895 Activated
## 3 -0.80660388 0.700 0.0014921229 0.057945449 0.20740508 Inhibited
## 4 -3.19554279 0.168 0.0016674949 0.057945449 0.23178180 Inhibited
## 5 -4.46271459 0.004 0.0029170156 0.071802353 0.40546517 Inhibited
## 6 2.53667607 0.024 0.0031869824 0.071802353 0.44299055 Activated
```

```
data("GSE3467")
result <- process(GSE3467)
exprs nrom <- result$exprs
normal <- result$normal
tumor <- result$tumor</pre>
DE <- result$DE
ALL <- result$ALL
res = spiapcc( de=DE, all=ALL,normal = normal,tumor = tumor, gse_madat2 = exprs_nrom, organism="hsa",n
                   beta=NULL,combine="fisher",verbose=T, flag = 0)
##
## Done pathway 1 : RNA transport..
## Done pathway 2 : RNA degradation..
## Done pathway 3 : PPAR signaling pathway..
## Done pathway 4 : Fanconi anemia pathway..
## Done pathway 5 : MAPK signaling pathway..
## Done pathway 6 : ErbB signaling pathway..
## Done pathway 7 : Calcium signaling pathway...
## Done pathway 8 : Cytokine-cytokine receptor int..
## Done pathway 9 : Chemokine signaling pathway...
## Done pathway 10 : NF-kappa B signaling pathway...
## Done pathway 11 : Phosphatidylinositol signaling..
## Done pathway 12 : Neuroactive ligand-receptor in..
## Done pathway 13 : Cell cycle..
## Done pathway 14 : Oocyte meiosis..
## Done pathway 15 : p53 signaling pathway..
## Done pathway 16 : Sulfur relay system..
## Done pathway 17 : SNARE interactions in vesicula..
## Done pathway 18: Regulation of autophagy..
## Done pathway 19 : Protein processing in endoplas..
## Done pathway 20 : Lysosome..
## Done pathway 21 : mTOR signaling pathway..
## Done pathway 22 : Apoptosis..
## Done pathway 23 : Vascular smooth muscle contrac..
## Done pathway 24 : Wnt signaling pathway..
## Done pathway 25 : Dorso-ventral axis formation..
## Done pathway 26 : Notch signaling pathway...
## Done pathway 27 : Hedgehog signaling pathway...
## Done pathway 28 : TGF-beta signaling pathway...
## Done pathway 29 : Axon guidance..
## Done pathway 30 : VEGF signaling pathway..
## Done pathway 31 : Osteoclast differentiation..
## Done pathway 32 : Focal adhesion..
## Done pathway 33 : ECM-receptor interaction..
## Done pathway 34 : Cell adhesion molecules (CAMs)...
## Done pathway 35 : Adherens junction..
## Done pathway 36 : Tight junction..
## Done pathway 37 : Gap junction..
## Done pathway 38 : Complement and coagulation cas..
## Done pathway 39 : Antigen processing and present..
## Done pathway 40 : Toll-like receptor signaling p..
```

Done pathway 41 : NOD-like receptor signaling pa..

```
## Done pathway 42 : RIG-I-like receptor signaling ..
## Done pathway 43 : Cytosolic DNA-sensing pathway...
## Done pathway 44 : Jak-STAT signaling pathway...
## Done pathway 45 : Natural killer cell mediated c..
## Done pathway 46 : T cell receptor signaling path..
## Done pathway 47 : B cell receptor signaling path..
## Done pathway 48 : Fc epsilon RI signaling pathwa..
## Done pathway 49 : Fc gamma R-mediated phagocytos..
## Done pathway 50 : Leukocyte transendothelial mig..
## Done pathway 51 : Intestinal immune network for ..
## Done pathway 52 : Circadian rhythm - mammal..
## Done pathway 53 : Long-term potentiation..
## Done pathway 54 : Neurotrophin signaling pathway...
## Done pathway 55 : Retrograde endocannabinoid sig..
## Done pathway 56 : Glutamatergic synapse..
## Done pathway 57 : Cholinergic synapse..
## Done pathway 58 : Serotonergic synapse..
## Done pathway 59 : GABAergic synapse..
## Done pathway 60 : Dopaminergic synapse..
## Done pathway 61 : Long-term depression..
## Done pathway 62 : Olfactory transduction..
## Done pathway 63 : Taste transduction..
## Done pathway 64 : Phototransduction..
## Done pathway 65 : Regulation of actin cytoskelet..
## Done pathway 66 : Insulin signaling pathway...
## Done pathway 67 : GnRH signaling pathway..
## Done pathway 68 : Progesterone-mediated oocyte m..
## Done pathway 69 : Melanogenesis..
## Done pathway 70 : Adipocytokine signaling pathwa..
## Done pathway 71 : Type II diabetes mellitus..
## Done pathway 72 : Type I diabetes mellitus..
## Done pathway 73 : Maturity onset diabetes of the..
## Done pathway 74 : Aldosterone-regulated sodium r..
## Done pathway 75 : Endocrine and other factor-reg..
## Done pathway 76 : Vasopressin-regulated water re..
## Done pathway 77 : Salivary secretion..
## Done pathway 78 : Gastric acid secretion..
## Done pathway 79 : Pancreatic secretion..
## Done pathway 80 : Carbohydrate digestion and abs..
## Done pathway 81 : Bile secretion..
## Done pathway 82 : Mineral absorption..
## Done pathway 83 : Alzheimer's disease..
## Done pathway 84 : Parkinson's disease..
## Done pathway 85 : Amyotrophic lateral sclerosis ...
## Done pathway 86 : Huntington's disease..
## Done pathway 87 : Prion diseases..
## Done pathway 88 : Cocaine addiction..
## Done pathway 89 : Amphetamine addiction..
## Done pathway 90 : Morphine addiction..
## Done pathway 91 : Alcoholism...
## Done pathway 92 : Bacterial invasion of epitheli..
## Done pathway 93 : Vibrio cholerae infection..
## Done pathway 94 : Epithelial cell signaling in H..
## Done pathway 95 : Pathogenic Escherichia coli in..
```

```
## Done pathway 96 : Shigellosis..
## Done pathway 97 : Salmonella infection..
## Done pathway 98 : Pertussis..
## Done pathway 99 : Legionellosis..
## Done pathway 100 : Leishmaniasis...
## Done pathway 101 : Chagas disease (American trypa...
## Done pathway 102 : African trypanosomiasis...
## Done pathway 103 : Malaria..
## Done pathway 104 : Toxoplasmosis..
## Done pathway 105 : Amoebiasis..
## Done pathway 106 : Staphylococcus aureus infectio..
## Done pathway 107 : Tuberculosis...
## Done pathway 108 : Hepatitis C..
## Done pathway 109 : Measles...
## Done pathway 110 : Influenza A..
## Done pathway 111 : HTLV-I infection..
## Done pathway 112 : Herpes simplex infection..
## Done pathway 113 : Epstein-Barr virus infection..
## Done pathway 114 : Pathways in cancer..
## Done pathway 115 : Transcriptional misregulation ...
## Done pathway 116 : Viral carcinogenesis..
## Done pathway 117 : Colorectal cancer..
## Done pathway 118 : Renal cell carcinoma..
## Done pathway 119 : Pancreatic cancer..
## Done pathway 120 : Endometrial cancer..
## Done pathway 121 : Glioma..
## Done pathway 122 : Prostate cancer..
## Done pathway 123 : Thyroid cancer..
## Done pathway 124 : Basal cell carcinoma..
## Done pathway 125 : Melanoma..
## Done pathway 126 : Bladder cancer..
## Done pathway 127 : Chronic myeloid leukemia..
## Done pathway 128 : Acute myeloid leukemia..
## Done pathway 129 : Small cell lung cancer..
## Done pathway 130 : Non-small cell lung cancer..
## Done pathway 131 : Asthma..
## Done pathway 132 : Autoimmune thyroid disease..
## Done pathway 133 : Systemic lupus erythematosus..
## Done pathway 134 : Rheumatoid arthritis...
## Done pathway 135 : Allograft rejection..
## Done pathway 136 : Graft-versus-host disease..
## Done pathway 137 : Arrhythmogenic right ventricul..
## Done pathway 138 : Dilated cardiomyopathy..
## Done pathway 139 : Viral myocarditis...
res <- res[,-12]
head(res)
##
                                         ID pSize NDE
                                Name
                                                              pNDE
## 1 Cell adhesion molecules (CAMs) 04514
                                                  63 1.475773e-07 6.036699
                                              130
## 2 Staphylococcus aureus infection 05150
                                              51
                                                   32 9.937630e-08 4.498668
## 3
            ECM-receptor interaction 04512
                                              85 33 1.188292e-02 6.390686
## 4
                   Viral myocarditis 05416
                                              68 34 4.626103e-05 3.292822
## 5
                        Tuberculosis 05152
                                              176 73 2.298166e-05 6.895598
## 6
                Salmonella infection 05132
                                              81 38 1.005036e-04 3.155768
```

```
## pPERT pG pGFdr pGFWER Status
## 1 5.0e-06 2.135074e-11 2.967753e-09 2.967753e-09 Activated
## 2 6.3e-02 1.245190e-07 8.654072e-06 1.730814e-05 Activated
## 3 5.0e-06 1.047998e-06 4.855725e-05 1.456718e-04 Activated
## 4 2.0e-03 1.590993e-06 5.528699e-05 2.211480e-04 Activated
## 5 8.0e-03 3.035257e-06 8.438015e-05 4.219008e-04 Activated
## 6 5.6e-02 7.366033e-05 1.706464e-03 1.023879e-02 Activated
```

R version information

```
## R version 3.4.1 (2017-06-30)
## Platform: i386-w64-mingw32/i386 (32-bit)
## Running under: Windows 7 (build 7601) Service Pack 1
## Matrix products: default
##
## locale:
## [1] LC_COLLATE=Chinese (Simplified)_People's Republic of China.936
## [2] LC_CTYPE=Chinese (Simplified)_People's Republic of China.936
## [3] LC_MONETARY=Chinese (Simplified)_People's Republic of China.936
## [4] LC NUMERIC=C
## [5] LC_TIME=Chinese (Simplified)_People's Republic of China.936
##
## attached base packages:
## [1] stats4
                 parallel stats
                                     graphics grDevices utils
                                                                    datasets
## [8] methods
                 base
##
## other attached packages:
  [1] spiapcc_0.1.0
## [2] hgu133plus2.db_3.2.3
## [3] SPIA_2.28.0
## [4] KEGGgraph_1.38.0
## [5] KEGGdzPathwaysGEO_1.14.0
## [6] KEGGandMetacoreDzPathwaysGEO_0.110.0
## [7] EnrichmentBrowser_2.6.0
## [8] pathview_1.16.1
## [9] org.Hs.eg.db 3.4.1
## [10] GSEABase_1.38.0
## [11] graph_1.54.0
## [12] annotate_1.54.0
## [13] XML 3.98-1.9
## [14] AnnotationDbi_1.38.1
## [15] IRanges_2.10.2
## [16] S4Vectors_0.14.3
## [17] Biobase_2.36.2
## [18] BiocGenerics_0.22.0
## [19] knitr_1.20
##
## loaded via a namespace (and not attached):
##
                                       munsell_0.5.0
     [1] httr_1.2.1
##
     [3] latticeExtra_0.6-28
                                       KEGGREST_1.16.0
##
     [5] pillar_1.2.1
                                       pkgconfig_2.0.1
##
     [7] R.utils_2.5.0
                                       BSgenome_1.44.2
```

```
##
     [9] dichromat_2.0-0
                                       compiler_3.4.1
##
   [11] DBI 0.7
                                       lazyeval_0.2.0
## [13] tibble 1.4.2
                                       PFAM.db 3.4.1
                                       R6_2.2.2
## [15] httpuv_1.3.5
##
   [17] ensembldb_2.0.3
                                       yaml_2.1.14
  [19] BiocInstaller 1.26.1
##
                                       data.table 1.10.4
## [21] reshape 0.8.6
                                       xtable 1.8-2
## [23] tools 3.4.1
                                       stringr_1.3.0
##
   [25] rtracklayer_1.36.4
                                       mime_0.5
## [27] shiny_1.0.3
                                       png_0.1-7
## [29] R.oo_1.21.0
                                       GOstats_2.42.0
## [31] digest_0.6.12
                                       GO.db_3.4.1
## [33] GenomeInfoDb_1.12.2
                                       GGally_1.3.1
## [35] base64enc_0.1-3
                                       GenomicAlignments_1.12.1
## [37] genefilter_1.58.1
                                       scales_1.0.0
##
   [39] memoise_1.1.0
                                       stringi_1.1.7
## [41] locfit_1.5-9.1
                                       R.methodsS3_1.7.1
  [43] limma 3.32.3
                                       GenomeInfoDbData 0.99.0
## [45] lattice_0.20-35
                                       AnnotationForge_1.18.1
   [47] bit64 0.9-7
                                       interactiveDisplayBase_1.14.0
## [49] biovizBase_1.24.0
                                       Rcpp_0.12.19
## [51] OrganismDbi_1.18.0
                                       Hmisc_4.0-3
## [53] Formula_1.2-2
                                       ggplot2_3.0.0
## [55] htmlTable 1.9
                                       Category_2.42.1
## [57] ProtGenerics 1.8.0
                                       grid_3.4.1
## [59] ReportingTools_2.16.0
                                       blob_1.1.0
## [61] GenomicRanges_1.28.4
                                       plyr_1.8.4
## [63] RBGL_1.52.0
                                       survival_2.41-3
## [65] edgeR_3.18.1
                                       AnnotationFilter_1.0.0
## [67] DelayedArray_0.2.7
                                       rprojroot_1.3-2
##
   [69] acepack_1.4.1
                                       matrixStats_0.52.2
## [71] rpart_4.1-11
                                       Rgraphviz_2.20.0
  [73] magrittr_1.5
                                       SummarizedExperiment_1.6.3
                                       Biostrings_2.44.1
##
  [75] VariantAnnotation_1.22.3
##
   [77] gridExtra_2.2.1
                                       htmlwidgets 0.9
## [79] curl_2.7
                                       checkmate_1.8.3
## [81] biomaRt 2.32.1
                                       htmltools 0.3.6
## [83] RSQLite_2.0
                                       ggbio_1.24.1
## [85] nnet_7.3-12
                                       gtable_0.2.0
## [87] zlibbioc_1.22.0
                                       colorspace_1.3-2
## [89] geneplotter 1.54.0
                                       MASS 7.3-47
## [91] cluster_2.0.6
                                       XVector 0.16.0
## [93] RCurl 1.95-4.8
                                       DESeq2_1.16.1
## [95] bitops_1.0-6
                                       RColorBrewer_1.1-2
## [97] Matrix_1.2-10
                                       foreign_0.8-69
## [99] hwriter_1.3.2
                                       bit_1.1-12
## [101] GenomicFeatures_1.28.4
                                       reshape2_1.4.2
## [103] rmarkdown_1.9
                                       AnnotationHub_2.8.2
## [105] splines_3.4.1
                                       evaluate_0.10.1
## [107] rlang_0.2.0
                                       BiocParallel_1.10.1
## [109] backports_1.1.0
                                       Rsamtools_1.28.0
```