Gene Set Enrichment Analysis GSEA User Guide

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Introduction

Gene Set Enrichment Analysis (GSEA) is a computational method that determines whether an *a priori* defined set of genes shows statistically significant, concordant differences between two biological states (e.g. phenotypes). The Gene Set Enrichment Analysis PNAS paper fully describes the algorithm. The GSEA software makes it easy to run the analysis and review the results, allowing you to focus on interpreting the analysis results.

The basic steps for running an analysis in GSEA are as follows:

1. Prepare your data files:

See Preparing Data Files for GSEA.

- Expression dataset file (res, gct, pcl, or txt)
- Phenotype labels file (cls)
- Gene sets file (gmx or gmt)
- Chip (array) annotation file (chip)
- 2. Load your data files into GSEA.
- 3. Set the analysis parameters and run the analysis.
- 4. View the analysis results.

See Loading Data.

See Running Analyses.

See Viewing Analysis Results.

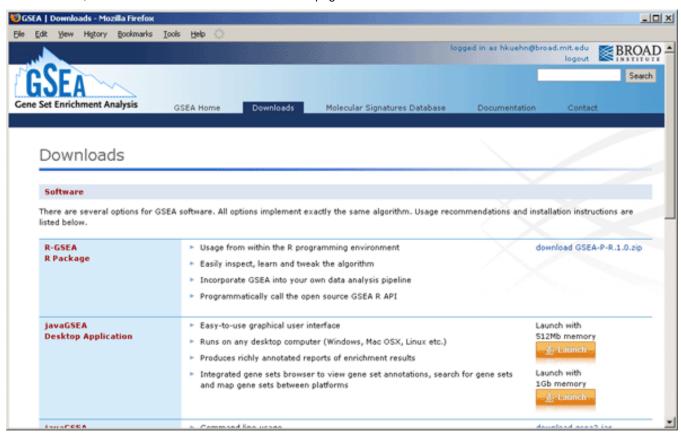
Getting Started

This section contains the following topics:

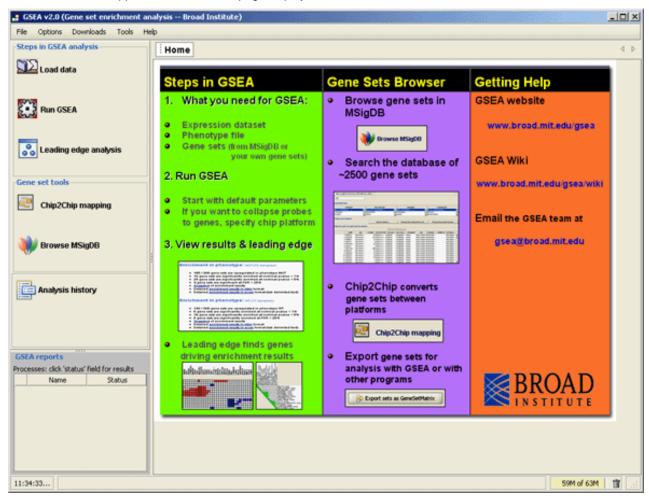
- Starting GSEA
- Other Ways to Start GSEA
- Exiting GSEA
- Getting Help

Starting GSEA

To start GSEA, click the Launch button on the Downloads page of the GSEA web site:



The GSEA window appears with the Home page displayed:



The icons on the left provide quick access to the most common actions. The Tools menu provides access to additional GSEA tools. Typically, each action you select opens a new page in the GSEA window. For example, selecting the Load Data icon opens the Load Data page.

The Processes pane in the bottom left corner of the GSEA window displays status information when you run an analysis.

GSEA user preferences are stored in the gsea_home directory (*Help>Show GSEA home folder*). GSEA analysis reports are stored in the GSEA output folder (*Help>Show GSEA output folder*). To change the location of the GSEA output folder and other preferences, use the Preferences Window.

Other Ways to Start GSEA

You can run GSEA in multiple ways:

- The GSEA desktop application provides an easy-to-use graphical interface. When you launch the application from the
 download page of the GSEA web site, as described above, you are using Java Web Start technology
 (http://java.sun.com/products/javawebstart/) to download, install, and start the application.
- The GSEA .jar file provides command line access to GSEA, as described in Running GSEA from the Command Line. You can download the .jar file from the download page of the GSEA web site.
- The GSEA .jar file also allows you to run the GSEA desktop application without being connected to the internet. Simply double-click the downloaded the .jar file to start the GSEA desktop application. You can use most functions in GSEA without being connected to the internet; for example, you can load files, run analyses, and review analysis results. However, you need to be connected to the internet to view the GSEA documentation (including online Help), access the GSEA web site, or access the Broad ftp web site (which holds MSigDB gene sets and array annotation files).
- R-GSEA makes GSEA available from the R programming environment. For more information, see the R-GSEA Readme.
- A GSEA GenePattern module makes GSEA available from GenePattern.

This guide focuses on the GSEA desktop application and provides instructions for running GSEA from the command line. It does not provide information about R-GSEA or the GSEA GenePattern module.

Exiting GSEA

To exit from GSEA:

- 1. Check that all analyses that you have started have completed. Any analyses still running will be stopped when you exit.
- 2. Select File>Exit. The GSEA window closes.

Getting Help

The GSEA web site is your primary source of help for GSEA. It includes the following resources:

- Documentation. The GSEA documentation includes this User Guide, a Tutorial that walks you through key features of GSEA, and a FAQ that answers frequently asked questions.
- MSigDb, the Molecular Signature Database. This database provides curated gene sets for use with the gene set enrichment analysis. Each gene set is described by a gene set page.
- Publications. The web site provides a link to the Gene Set Enrichment Analysis PNAS paper. It also provides links to many other papers that cite GSEA.
- Array annotation files. Each file lists the probes on a DNA chip (array) and their matching HUGO gene symbol. GSEA
 uses array annotation files to translate between probe IDs and gene symbols, and to include gene annotations in the gene
 set enrichment analysis report.
- Example datasets. The datasets used in the Gene Set Enrichment Analysis PNAS paper and other publications.

If you cannot find the answers to your questions in the manual or the FAQ, contact us at gsea@broadinstitute.org. Please use the same address to report problems with the GSEA software or the MSigDb.

Preparing Data Files for GSEA

When you use GSEA, you supply four data files: an expression dataset file, phenotype labels file, gene sets file, and chip annotations file. The following table lists each data file and its valid file formats. All files are tab-delimited ASCII text files; they can be created and edited using any text editor.

For descriptions and examples of each file format, see GSEA file formats. For more information about each data file, click the data file link in the following table.

Data File	Content	Format	Source
Expression dataset	Contains features (genes or probes), samples, and an expression value for each feature in each sample. Expression data can come from any source (Affymetrix, Stanford cDNA, and so on).	res, gct, pcl, or txt	You create the file.
Phenotype labels	Contains phenotype labels and associates each sample with a phenotype.	cls	You create the file or have GSEA create it for you.
Gene sets	Contains one or more gene sets. For each gene set, gives the gene set name and list of features (genes or probes) in that gene set.	gmx or gmt	You use the files on the Broad ftp site, export gene sets from the Molecular Signature Database (MSigDb) or create your own gene sets file.
Chip annotations	Lists each probe on a DNA chip and its matching HUGO gene symbol. Optional for the gene set enrichment analysis.	Chip	You use the files on the Broad ftp site, download the files from the GSEA web site, or create your own chip file.

The expression dataset, gene sets, and chip annotation files all contain lists of features (genes or probes) to be analyzed. It is critical that you use the same feature (gene or probe) identifiers across all of the data files. For more information, see Consistent Feature Identifiers Across Data Files.

Consistent Feature Identifiers Across Data Files

Typically, the feature identifiers in your expression dataset are the probe identifiers for the DNA chip array used to produce the data. For example, an expression dataset produced using the HG_U133A chip contains HG_U133A probe identifiers and an expression dataset produced using the HG_U95Av2 chip contains HG_U95Av2 probe identifiers. When using GSEA, it is critical that your expression dataset, gene sets, and chip annotation files all use the same feature identifiers.

Typically, you use one of two approaches to ensure that you are using consistent feature identifiers across files: you collapse your probe sets into genes and use the HUGO gene symbols as your consistent feature identifiers or you use the probe identifiers from your expression dataset as your consistent feature identifiers.

- HUGO gene symbols. To use HUGO gene symbols as your consistent feature identifiers:
 - Specify your expression dataset.
 - Set the Collapse dataset to gene symbols parameter to True when you run the gene set enrichment analysis; this indicates that you want to use gene symbols. This causes GSEA to collapse the probe sets in the dataset to a single vector for the gene, which gets identified by its HUGO gene symbol. Collapsing the dataset has two benefits: (1) it eliminates multiple probes, which can inflate enrichment scores, and (2) it facilitates the biological interpretation of the gene set enrichment analysis results.
 - Specify gene sets that list genes by their HUGO gene symbol. The gene sets on the Broad ftp site were exported from the Molecular Signature Database (MSigDb) and list genes by HUGO gene symbol.
 - Specify a chip annotation file that maps the probe identifiers in your expression dataset to their HUGO gene symbols.
 GSEA uses the chip annotation file to collapse each probe set into a single vector for the gene, which gets identified by its HUGO gene symbol, and to include HUGO gene annotations in the analysis report.

This approach is recommended by the GSEA team; therefore, by default the *Collapse dataset to gene symbols* parameter is set to True.

- Probe identifiers. To use probe identifiers as your consistent feature identifiers:
 - Specify your expression dataset.
 - Set the Collapse dataset to gene symbols parameter to False when you run the gene set enrichment analysis; this
 indicates that you want to use the native identifiers in your dataset. GSEA does not collapse the probe sets in your
 expression dataset. You are choosing to analyze probes rather the genes.

- Specify gene sets that list genes using the same probe identifiers as those in your expression dataset (that is, the
 probe identifiers for the DNA chip used to produce your expression dataset). You cannot use the gene sets on the
 Broad ftp site because they list genes by HUGO gene symbol. However, you can export gene sets from the MSigDb,
 specifying the DNA chip used to produce your expression dataset as the target chip for the exported gene sets file.
- Optionally, specify a chip annotation file that maps the probe identifiers in your expression dataset to their HUGO
 gene symbols. GSEA uses the chip annotation file to include HUGO gene annotations in the analysis report; if you do
 not provide the chip annotation file, the analysis report omits the gene annotations.

This approach is useful if you prefer not to use the HUGO gene symbols or your expression dataset contains probe identifiers that cannot be mapped to the HUGO gene symbols. For example, if you have an expression dataset produced using porcine DNA, you cannot map the porcine probe identifiers to HUGO gene symbols, which means you cannot create a chip annotation file. However, you can create gene sets that contain porcine probe identifiers, which means you can still run the gene set expression analysis.

One final note concerning consistent feature identifiers across files: within GSEA, HUGO gene symbols and probe identifiers are case sensitive; that is, the identifiers "TestGene1" and "TESTGENE1" are not the same.

Expression Datasets

An expression dataset file contains features (genes or probes), samples, and an expression value for each feature in each sample. It is a tab-delimited text file in res, gct, pcl, or txt format. For descriptions and examples of each file format, see GSEA file formats.

Because most gene expression data is already in tab-delimited text files, or in spreadsheet and database programs that allow you to export the data into tab-delimited text files, creating expression dataset files for GSEA is relatively easy:

- 1. Start with a tab-delimited file that contains your gene expression data.
- 2. Open the file in Excel or a text editor.
- 3. Make the necessary format changes: compare your current file with the file format described in GSEA file formats; add header rows, remove extra columns, and make any other changes necessary to create a properly formatted file.
- 4. Save the file as a tab-delimited text file with the appropriate file extension (res, gct, pcl, or txt).

Note: When you create an expression dataset file, the GSEA team recommends that the file name include the name of the DNA chip used to produce the expression data; for example, all_aml_dataset_hgu95av2.gct.

When creating expression dataset files, keep in mind the following:

- Expression data. GSEA works with expression data from any source. Although different processing methods produce
 different types of expression values (for example, natural scale versus logged expression levels for Affymetrix data, or
 Affymetrix data versus two-color ratio data), any type of expression values can be used to create your expression dataset
 file. The GSEA algorithm examines the differences in expression values, rather than the values themselves. (As in most
 data analysis methodologies, the same expression data represented in different formats may, of course, generate
 different analysis results.)
- Image data. GSEA does not process image data. If you have image data, you must use external software (such as Rosetta Resolver or Stanford Microarray Database) to convert the image data to numeric data.
- cDNA two-color ratio data. See cDNA Microarray Data.
- CEL files. If you are analyzing CEL files, each of which contains data for one sample, you will need to merge the collection
 of CEL files into a single expression dataset file. You can use the GenePattern module ExpressionFileCreator to merge
 CEL files into an expression dataset file. Alternatively, you can use tools such as RMAExpress or DCHIP to merge the
 CEL files and then create your expression dataset file based on that merged file.
- Genes. Each feature (gene or probe) must have a unique identifier. If the expression dataset contains redundant identifiers, GSEA arbitrarily selects one of the redundant features, removes the others and continues the analysis. The analysis report lists the redundant identifiers.
- Samples. Each sample must have a unique identifier. If you have technical replicates, you generally want to remove them
 by averaging or some other data reduction technique. For example, assume you have five tumor samples and five control
 samples each run three times (three replicate columns) for a total of 30 data columns. You would average the three
 replicate columns for each sample and create a dataset containing 10 data columns (five tumor and five control).
- Present/Marginal/Absent Calls. GSEA ignores Present/Marginal/Absent calls. If your dataset contains such calls, do not
 filter the data based on that information. The GSEA algorithm expects different levels of expression and provides better
 results when given all of the data.
- Missing expression values. The gct and pcl file formats support missing expression values; simply leave the cell blank if
 the expression data is missing. The res file format, which is specific to Affymetrix chips, does not allow missing expression
 values.

You can run the gene set enrichment analysis against an expression dataset that is missing values. The GSEA software does not impute missing values or filter out genes that have too many missing values; it simply ignores the missing values in its ranking metric calculations. However, too many missing values for a gene may cause the differential expression scores for that gene to be inaccurate. For example, consider a dataset that contains 10 samples in class_A and 15 samples in class_B. Assume that a gene has only 3 values in class_A and all 15 values in class_B. The GSEA software uses the 3 values in class_A and the 15 values in class_B to score the gene by its differential expression. In the signal-to-noise calculation, the mean and variance estimates for the gene are based on different sample sizes; a situation which it would be better to avoid. (If you wish, you can use external tools to impute missing values or filter out genes that have too many missing values.)

Filtering based on expression values. For many analytical algorithms, such as clustering, it makes sense to preprocess a
dataset. For example, before running hierarchical clustering, you might remove genes that have low variance across the
dataset. This prevents flat genes from driving the clustering result and improves processing time by focusing on a smaller
number of interesting genes.

The GSEA algorithm does not filter the expression dataset and does not benefit from your filtering of the expression dataset. During the analysis, genes that are poorly expressed or that have low variance across the dataset populate the middle of the ranked gene list and the use of a weighted statistic ensures that they do not contribute to a positive enrichment score. By removing such genes from your dataset, you may actually reduce the power of the statistic. Processing time is rarely a factor; GSEA can easily analyze 22,000 genes with even modest processing power.

Although GSEA does not require that you preprocess the expression dataset, it can be used effectively on preprocessed datasets. For example, Monti et al used a filtered dataset to further analyze genes consistently expressed across two datasets, as described in "Molecular profiling of diffuse large B-cell lymphoma identifies robust subtypes including one characterized by host inflammatory response" (http://www.bloodjournal.org/cgi/content/full/bloodjournal;105/5/1851).

Phenotype Labels

A phenotype label file, also known as a class file or template file, defines phenotype labels and assigns those labels to the samples in your expression dataset. A phenotype label file is a tab-delimited text file in cls format. For descriptions and examples of the cls file format, see GSEA file formats.

- About Phenotype Labels
- Creating Phenotype Labels
- Selecting Phenotypes Labels to Analyze

About Phenotype Labels

The GSEA algorithm works with both categorical labels and continuous labels:

- A categorical label defines a discrete phenotype. If you are using categorical labels, you must define at least two labels (for example, tumor and normal), but you may define as many as necessary (for example, ALL, MLL, and AML). The GSEA algorithm analyzes two labels at time (for example, ALL versus MLL or ALL versus not_ALL). If you choose to analyze two labels and your phenotype file contains more than those two labels, GSEA analyzes only the samples with the selected labels and omits all other samples from the analysis. This makes it easy to analyze subsets of your expression datasets.
- A continuous label defines a phenotype profile, which is used to analyze a time series experiment or to find gene sets
 that correlate with a gene of interest (gene neighbors). A continuous label contains a value for each sample, where that
 series of values defines the phenotype profile:
 - For a gene of interest, the value for each sample is the expression value of the gene. The phenotype profile is, therefore, the expression profile of the gene of interest.
 - For a time series, the value for each sample is a number chosen to define the desired expression profile. The relative change in the value for each sample defines the relative distance between points in the profile. Assume, for example, that you have five samples taken at 30 minute intervals.

To define a phenotype profile that shows steadily increasing gene expression, you would choose steadily increasing values for each sample (perhaps the number of minutes elapsed since the initial treatment):

#numeric #IncreasingProfle 30 60 90 120 150

To define a phenotype profile that shows an initial peak and then gradual decrease, you would choose values for each sample that reflect that desired phenotype profile:

#numeric #PeakProfle 5 20 15 10 5

Creating Phenotype Labels

To create a phenotype labels file:

- 1. Open Excel or a text editor.
- Create the phenotype label file using the cls file format (see GSEA file formats). Every label defined in the phenotype labels file must be assigned to at least one sample in the expression dataset. Every sample in the expression dataset must be assigned a label.
- Save the file as a tab-delimited text file with the file extension cls.

Typically, you create a phenotype label file before running the gene set enrichment analysis; however, you can also have GSEA create phenotype label files for you when you run the analysis, as described in the next section.

Selecting Phenotype Labels to Analyze

When you run the gene set enrichment analysis, you select a continuous phenotype label or a pair of categorical phenotype labels. When you run an analysis using the Run GSEA Page, you can select the phenotype labels in the following ways:

- Select a phenotype labels file that you have created and select a continuous phenotype label or a pair of categorical phenotype labels from that file.
- Create an on-the-fly phenotype. GSEA presents a dialog box that allows you to define two categorical phenotype labels. You enter the name of the dataset that you are using, two phenotype labels, and the samples from your dataset that are associated with each phenotype. GSEA ensures that the samples are in your dataset and creates the phenotype labels file for you. If your dataset contains samples that you did not include in the two phenotypes, GSEA automatically excludes them from the gene set enrichment analysis.
- Use a gene as a phenotype. You select a gene from your dataset and GSEA creates a continuous phenotype label file for you. In the phenotype file, the value for each sample is the expression value of the gene that you selected.

Gene Sets

A gene sets file defines one or more gene sets. For each gene set, the file contains the gene set name and the list of genes in that gene set. A gene sets file is a tab-delimited text file in gmx or gmt format. For descriptions and examples of each file format, see GSEA file formats.

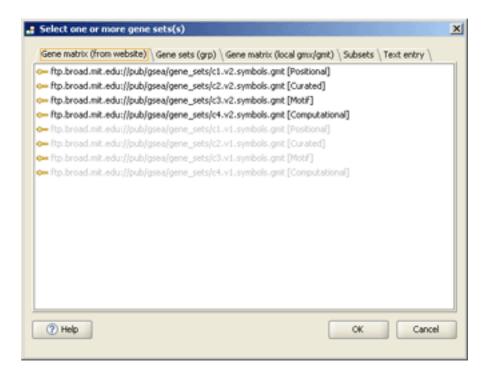
The Molecular Signature Database (MSigDb) is a publicly accessible collection of curated gene sets that is maintained by the GSEA team and extensively documented by GeneSetPages. The team appreciates contributions to this shared resource and encourages users to submit their gene sets to gsea@broadinstitute.org.

- Selecting Gene Sets from the Web Site
- Exporting Gene Sets from MSigDB
- Creating Gene Sets
- Gene Sets and GSEA

Selecting Gene Sets from the Web Site

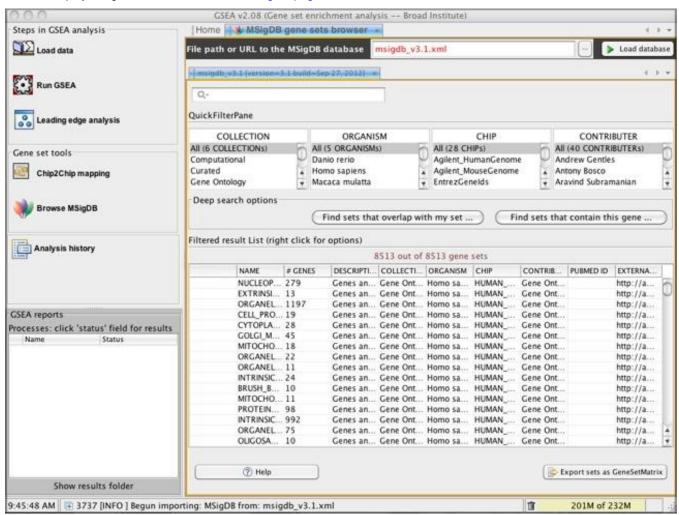
When you run an analysis, you can select gene set files from the Broad ftp web site. These files are created and maintained by the GSEA team for your convenience. They contain gene sets exported from the MSigDB. The gene set file name indicates the content of the file. For example, the gene set file c2.v2.symbols.gmt, contains the C2 gene sets exported from version 2.0 of the MSigDB with the genes in the gene sets identified by HUGO gene symbol.

For a list of the gene set files on the web site, click the Run GSEA icon to display the Run GSEA page and click the ... button next to the *Gene sets database* parameter:



Exporting Gene Sets from MSigDB

You can use the Browse MSigDB page to explore the gene sets in the MSigDB and to export gene sets of interest to gene set files. To display the gene sets on the Browse MSigDB page, click the *Load database* button:



From this page, you can:

- Use the fields at the top of the page to filter the gene sets displayed in the table.
- Select a gene set from the table and right-click to display information about the gene set.
- Export selected gene sets to a gene set file, selecting the feature identifiers (gene symbols or DNA chip platform of your choice) that you want to use to identify the genes in the gene sets.

For more information, see the Browse MSigDB page.

Creating Gene Sets

You can use the gene set files available on the Broad ftp site, export gene sets from the MSigDB, or create your own gene sets. To create a gene sets file:

- 1. Open Excel or a text editor.
- 2. Create a gene sets file using the gmx or gmt file format (see GSEA file formats).
 - When listing the genes in each gene set, be sure to use the appropriate gene identifiers (HUGO gene symbols or probe identifiers), as described in Consistent Feature Identifiers Across Data Files.
- 3. Save the file as a tab-delimited text file with the appropriate file extension (gmx or gmt).

Note: When you create a gene sets file, the GSEA team recommends that the file name include the gene identifier format you used to list the genes; for example, setname_hgu95av2.gct.

Gene Sets and GSEA

When choosing gene sets for a gene set enrichment analysis, keep in mind the following:

- When you run the gene set enrichment analysis, the GSEA software automatically preprocesses the gene sets, excluding
 any gene that is not in the expression dataset. For example, if you restricted a 22,000 gene HGU133A dataset to the 5000
 most reproducible genes, the GSEA software first discards all genes in the gene sets that are not in the restricted dataset
 and then continues with the analysis. Preprocessing the gene sets is critical because the gene set size affects the
 enrichment score statistic.
 - The GSEA software does not preprocess the expression dataset. The expression dataset may contain a significant number of genes that are not in any of the gene sets. The GSEA algorithm simply asks if the genes in a gene set are overrepresented at the top or bottom of the ranked list of genes from the expression dataset.
- When you run the gene set enrichment analysis, the GSEA software automatically normalizes the enrichment scores for variation in gene set size, as described in GSEA Statistics. Nevertheless, the normalization is not very accurate for extremely small or extremely large gene sets. For example, for gene sets with fewer than 10 genes, just 2 or 3 genes can generate significant results. Therefore, by default, GSEA ignores gene sets that contain fewer than 25 genes or more than 500 genes; defaults that are appropriate for datasets with 10,000 to 20,000 features. To change these default values, use the Max Size and Min Size parameters on the Run GSEA Page; however, keep in mind the possibility of inflated scorings for very small gene sets and inaccurate normalization for large ones.
- GSEA analysis results include a report that lists the gene sets included in and excluded from the analysis. For each gene
 set included in the analysis, the report lists the total number of genes in the set and the number of genes in the set after
 filtering out genes that are not in the expression dataset.
- When you run the gene set enrichment analysis, try to avoid analyzing gene sets that contain the same sets of genes. Because the false discovery rate (FDR) statistic is based on all gene sets, duplicate gene sets can skew this critical statistic. In some cases, gene sets may contain the same genes identified by different names. These duplicate gene sets are most often found after running the analysis, when you look carefully at the leading edge subsets and notice that the genes are the same although the gene names are different.

DNA Chip (Array) Annotations

A DNA chip (array) annotations file lists each probe on a DNA chip and its matching HUGO gene symbol. A chip annotations file is a tab-delimited text file in chip or csv format. For descriptions and examples of the chip annotations file formats, see GSEA file formats.

- How GSEA Uses DNA Chip Annotations
- Selecting DNA Chip Annotations from the Web Site
- Creating DNA Chip Annotations
- Ambiguous Mappings

How GSEA Uses DNA Chip Annotations

When you run the gene set enrichment analysis (Run GSEA or GSEAPreranked):

- GSEA uses the selected chip annotation files to include HUGO gene annotations in the analysis report. If you do not
 select a chip annotation file, the analysis report displays the gene descriptions from the expression dataset file. If you
 select a chip annotation file, GSEA includes HUGO gene annotations in the analysis report.
- If you are collapsing your dataset (*Collapse dataset to gene symbols* parameter = True), GSEA uses the selected chip annotation files to collapse each probe set in the expression dataset file into a single vector for the gene, which is identified by its HUGO gene symbol.

When you use Chip2Chip to translate a gene set from gene symbols to the probe identifiers of a chip platform, GSEA uses the selected chip annotation files to translate HUGO gene symbols in the gene sets to the matching probe identifiers for the target chip(s).

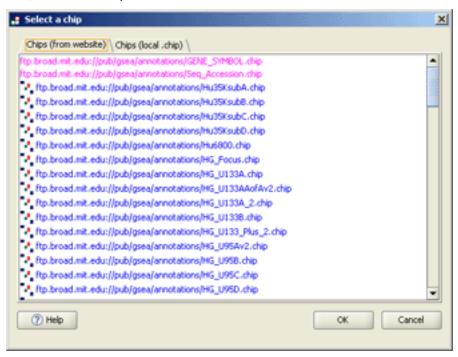
When you use Browse MSigDB to export gene sets from the MSigDB, you select a target chip for the gene sets. GSEA uses Chip2Chip and the selected chip annotation files to translate the HUGO gene symbols in the MSigDB gene sets to the matching probe identifiers for the target chip.

Selecting DNA Chip Annotations from the Web Site

When you run an analysis, you can select chip annotation files from the Broad ftp web site. These files are created and maintained by the GSEA team for your convenience. The web site includes chip annotation files for commonly used DNA chips (human, mouse, and other organisms), as well as two specially defined chip files:

- Gene symbols lists all of the gene symbols known to GSEA. It is assembled primarily from NCBI Entrez databases.
- Seq_accessions lists all sequence accessions known to GSEA. It is assembled primarily from GenBank identifiers
 and the gene symbols and common aliases defined in the GENE_SYMBOL.chip file.

For a list of the chip annotation files on the web site, click the Run GSEA icon to display the Run GSEA page and click the ... button next to the *Chip platform(s)* parameter. The two specially defined chip files are displayed in pink, Affymetrix chips in blue, and all other chips in black:



Expression datasets can be compiled from multiple sources; therefore, when GSEA prompts you to select a chip platform, it generally allows you select one or more chip annotation files.

Creating DNA Chip Annotations

If you cannot find a chip annotations file for the chip that you are using, you can create one. Creating a chip annotations file is easy; however, mapping your probe identifiers to HUGO gene symbols may be difficult or impossible. To create a chip annotations file:

1. Start with a tab-delimited file (or text file) that lists the probes on the chip. The chip manufacturer generally provides this file.

- 2. Open the file in Excel or a text editor.
- 3. Make the necessary format changes: compare your current file with the chip file format described in GSEA file formats; add header rows, remove extra columns, and make any other changes necessary to create a properly formatted file.
- 4. Using whatever information you have available (for example, ortholog data), determine the matching HUGO gene symbol for each probe and add it to the file. If you cannot determine the HUGO gene symbol, enter the probe name as the matching gene symbol. As mentioned above, depending on the chip that you are using, it may be difficult or impossible to determine matching gene symbols. For example, porcine DNA probes cannot be mapped to HUGO gene symbols.
- 5. Save the file as a tab-delimited text file with the file extension .chip.

Note: (1) The file name must not include hyphens (-). (2) When you create a chip annotation file, the GSEA team recommends that the file name be the name of DNA chip; for example, hgu95av2.chip.

Ambiguous Mappings

Chip files may contain ambiguous mappings, where a probe on the chip cannot be mapped to exactly one HUGO gene symbol. For example, OBRGRP /// LEPR:

```
Probe Set ID <tab> Gene Symbol <tab> Gene Title 202377_at <tab> OBRGRP /// LEPR <tab> na 211167_at <tab> OBRGRP <tab> Sample description for OBRGRP 289037 at <tab> LEPR <tab> Sample description for LEPR
```

GSEA does no special processing of ambiguous mappings; it treats the combination of gene symbols as a single gene symbol. In particular:

- When GSEA uses this chip file to collapse each probe set into a single vector for the gene, it collapses probes mapped to OBRGRP into one vector, probes mapped to LEPR into a second vector, and probes mapped to OBRGRP /// LEPR into a third vector.
- When the gene set enrichment analysis uses this chip annotation file to include HUGO gene annotations in the analysis report, probes mapped to OBRGRP /// LEPR will have the annotation specified for OBRGRP /// LEPR (in this case, na).

cDNA Microarray Data

An expression dataset file for cDNA ratio data contains features (genes or probes), samples, and a computed ratio value for each feature in each sample. A phenotype label file for cDNA ratio data assigns distinct phenotype labels to the samples in the expression dataset.

Ratio values for cDNA data can be computed using a variety of methods. How the ratios are computed determines whether it is possible to create a phenotype label file for the cDNA ratio data. For example:

• If ratios for all samples are computed against a common reference, as shown below, each sample can be assigned a distinct phenotype and it is possible to create a phenotype label file.

```
normal sample (Cy3) / common reference (Cy5) = phenotype 1 treated sample (Cy3) / common reference (Cy5) = phenotype 2
```

• If ratios are computed by comparing conditions, as shown below, it may not be possible to create a phenotype label file. normal sample (Cy3) / treated sample (Cy5) = phenotype

When you run the gene set enrichment analysis from the Run GSEA Page, GSEA ranks the features in the expression dataset and then analyzes the ranked list of features. GSEA provides a number of metrics for ranking genes; however, all of the metrics require a phenotype label file. Alternatively, you can create a ranked list of the features in the expression dataset and then use the GSEAPreranked Page to analyze that ranked list.

If you can assign distinct phenotypes to the samples in the cDNA ratio data, analyze the data using the Run GSEA page:

1. Create an expression dataset file for the cDNA ratio data. The file must be formatted as a pcl, res, gct, or txt file. For descriptions and examples of these file formats, see GSEA file formats.

Note: If the raw expression data contains two separate values for each gene in each sample, use external software to calculate the two-color ratios before creating the expression dataset file.

- 2. Create a phenotype label file that assigns a distinct phenotype label to each sample in the expression dataset file. The file must be formatted as a cls file. For a description of this file format, see GSEA file formats.
- Run the analysis using the Run GSEA Page.

If you cannot assign distinct phenotypes to the samples in the cDNA ratio data, analyze the data using the GSEAPreranked page:

1. Rank the features in the expression dataset using tools external to GSEA.

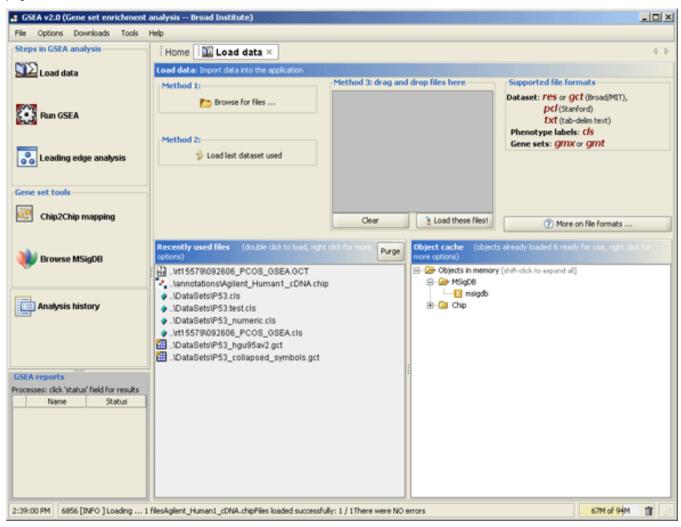
- 2. Create a ranked list file that contains the rank ordered list of features. The file must be formatted as an rnk file. For a description of this file format, see GSEA file formats.
- 3. Run the analysis using the GSEAPreranked Page.

When selecting the chip platform(s) to use for analyzing cDNA data, the GSEA team recommends selecting both the Stanford and seq_accession chip annotation files. This helps to ensure that any non-standard cDNA identifiers in your dataset are used in annotating the analysis reports and/or collapsing the dataset (see Consistent Feature Identifiers Across Data Files).

Loading Data

Before you can run an analysis, you must load the expression dataset (res, gct, pcl, or txt), phenotype label (cls), gene set (gmx or gmt), and chip annotation files to be analyzed. Loading the files stores the data in memory, where GSEA can work with it. You must load the data files into memory each time you open GSEA.

To load the data files, click the Load Data icon in the Navigator area of the GSEA window. GSEA displays the Load Data page:



From the Load Data page, you can load files in four ways:

- Click the *Browse for files* button. When the Open window appears, select the file(s) to load and then click the *Open* button. To select multiple files, use SHIFT-click or CTRL-click.
- Click the Load last dataset used button. GSEA loads the data used in the most recent gene set enrichment analysis.
- Drag-and-drop the files from a file browser window into the drag-and-drop pane. When the files that you want to load are
 listed in that pane, click the Load these files button. To remove files from the drag-and-drop pane, click the Clear button.
- In the Recently Used Files pane, double-click a file to load it.

GSEA loads the files and adds them to the Recently Used Files and Object Cache panes (if they are not yet listed):

- Recently Used Files lists the files that you have loaded into GSEA during this session and previous sessions. Files remain
 in this pane, even when you exit and restart GSEA, unless you select Options>Clear Recent File History to clear them.
- Object Cache lists the files in memory; that is, the files that you have loaded during this session. When you restart GSEA, nothing is in memory, so Object Cache is empty.

The icon next to a file name identifies the type of data it contains.

Select a file in the Recently Used Files or Object Cache pane and right-click in that area to display a context menu of tools appropriate for the selected file(s):

Tool	Description	Notes
Dataset Viewer	Opens a page in the GSEA window that displays the expression dataset.	Expression datasets only
Phenotype Viewer	Opens a page in the GSEA window that displays the phenotype labels and the number of samples associated with each.	Phenotype labels only
Report Viewer	Opens a page in the GSEA window that displays the analysis report, as it appears in the Analysis History page.	Reports only
Gene Matrix Viewer	Opens a page in the GSEA window that displays the gene set data.	Gene sets (database) only
Extract GeneSets from GeneMatrix	Creates a gene set group (grp) for each gene set in the gene set file. The gene sets are created in memory and deleted when you exit from GSEA. When you run an analysis and need to select gene sets for the analysis, you will see the new gene sets listed in the gene set selection window.	Gene sets (database) only
Convert the GeneMatrix into a Single GeneSet	Creates one gene set group (grp) that combines the genes in all of the gene sets into one large gene set. The gene set is created in memory and deleted when you exit from GSEA. When you run an analysis and need to select gene sets for the analysis, you will see the new gene set listed in the gene set selection window	Gene set (database) only
Gene Set Viewer	Opens a page in the GSEA window that displays the genes in the gene set.	Gene sets (group) only
Remove duplicates from the GeneSet	Removes duplicate genes from the gene set, overwriting the original gene set with the new gene set.	Gene sets (group) only
View Chip Annotation	Opens a page in the GSEA window that displays the probe to symbol mapping in the chip annotation file. (Typically, you do not load chip annotation files.)	Chip annotations only
Ranked List Viewer	Opens a page in the GSEA window that displays the ranked list of genes. For a ranked list file generated by GSEA, the display includes rank and rank metric scores.	Ranked lists only
Force Data Reload.	Loads the selected file again, overwriting the previously loaded data.	All files
Excel	Displays the file in Excel. (To specify the path for excel.exe, select Options>Preferences and modify the External Tools settings.)	All files
Textpad	Displays the file in Notepad. (To specify the path for notepad.exe, select <i>Options>Preferences</i> and modify the External Tools settings.)	All files
File Explorer	Displays the file in File Explorer. (To specify the path for explorer.exe, select <i>Options>Preferences</i> and modify the External Tools settings.)	All files
Copy Files	Copies the full path of the selected files to the clipboard. You can then paste that file name where needed.	All files Recently Used Files only
Import Data	Loads the selected files.	All files Recently Used Files only

Running Analyses

The primary analysis that you run in GSEA is the gene set enrichment analysis; however, GSEA also offers other tools, which are run as analyses. This section describes how to start and track analyses:

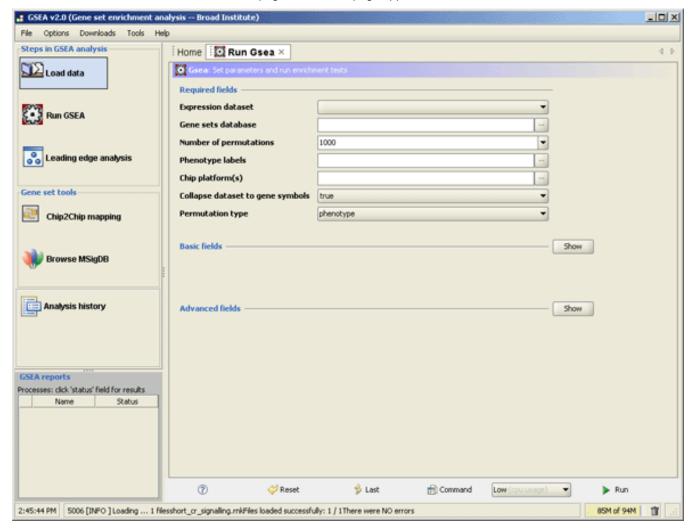
- Running a Gene Set Enrichment Analysis
- Running a Leading Edge Analysis
- Running Other GSEA Analyses
- Tracking Analysis Progress
- Rerunning an Analysis

Running a Gene Set Enrichment Analysis

As described in the Gene Set Enrichment Analysis PNAS paper, the gene set enrichment analysis is a computational method that determines whether an *a priori* defined set of genes shows statistically significant, concordant differences between two biological states (e.g. phenotypes).

To start a gene set enrichment analysis:

1. Select the Run GSEA icon on the GSEA main page. The GSEA page appears:



- Enter values for the parameters listed under Required Fields. Optionally, click Show to display the parameters under Basic Fields and Advanced Fields and enter values for those parameters as well. For descriptions of the parameters, click Help, which displays the Run GSEA Page of this guide.
- 3. Click Run to start the analysis.
- 4. Track analysis progress, as described in Tracking Analysis Progress.

- 5. View analysis results, as described in Viewing Analysis Results.
- 6. Interpret analysis results, as described in Interpreting GSEA Results.

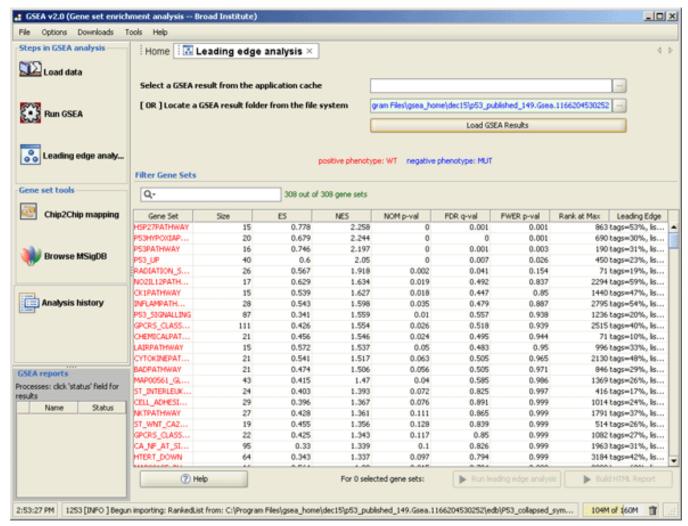
Running a Leading Edge Analysis

As described in the Gene Set Enrichment Analysis PNAS paper, the leading-edge subset in a gene set are those genes that appear in the ranked list at or before the point at which the running sum reaches its maximum deviation from zero. The leading-edge subset can be interpreted as the core that accounts for the gene set's enrichment signal.

After running the gene set enrichment analysis, you use the leading edge analysis to examine the genes that are in the leading-edge subsets of the enriched gene sets. A gene that is in many of the leading-edge subsets is more likely to be of interest than a gene that is in only a few of the leading-edge subsets.

To run the leading edge analysis:

- Select the Leading Edge Analysis icon on the GSEA main page. The Leading Edge Analysis page appears.
- 2. Select a Gene Set Enrichment Report either from the application cache (analyses that you have run, organized by name) or from the file system (any analysis stored in the file system).
- Click the Load GSEA Results button. GSEA updates the Leading Edge Analysis page to display the gene sets that were analyzed in the selected gene set enrichment report:



By default, gene sets are ordered by normalized enrichment score (NES). Click a column heading to reorder the gene sets based on the values in that column. For descriptions of the columns, see Interpreting GSEA Results.

By default, all gene sets are displayed. Use the filter box to display a subset of gene sets. As you enter text in the field, GSEA updates the list of gene sets to show only those that match the entered text. To change the text search options, click the magnifying class icon in the filter box.

- 4. Select one or more gene sets for the leading edge analysis. To select multiple gene sets, use SHIFT-click or CTRL-click.
- 5. Click Run leading edge analysis or Build HTML Report to start the analysis:

- Run leading edge analysis displays four graphs that help you visualize the overlap between the selected leading edge subsets. (Does not generate an analysis results report.)
- Build HTML Report creates an analysis results report that provides details on the leading edge subsets and the overlap between them. (Does not display the graphs.)
 - If you are building an HTML report: track analysis progress, as described in Tracking Analysis Progress, and view analysis results, as described in Viewing Analysis Results.
- 6. Interpret analysis results, as described in Interpreting Leading Edge Analysis Results.

Running Other GSEA Analyses

GSEA also provides the following analyses:

- Chip2Chip. Converts the genes in a gene set from HUGO gene symbols to the probe identifiers for a selected target chip.
 For example, if you have a dataset that uses probes from the HG_U95Av2 chip to identify genes, you can use this utility to convert MSigDB gene sets from HUGO gene symbols to probe identifiers for the HG_U95Av2 chip.
- GSEAPreranked. Runs the gene set enrichment analysis against a ranked list of genes, which you supply. When you use
 the Run GSEA icon to run the gene set enrichment analysis, GSEA ranks the genes in your expression dataset (based on
 the metric that you select using the metric for ranking genes parameter) and then analyzes that ranked list of genes.
 Alternatively, you can create your own ranked list of genes and use GSEAPreranked to analyze that ranked list of genes.
- CollapseDataset. Creates a new dataset by collapsing each probe set into a single vector for the gene, which is identified
 by its HUGO gene symbol. When you run the gene set enrichment analysis with the Collapse dataset to gene symbols
 parameter set to True, GSEA runs this analysis as part of the gene set enrichment analysis.

To run one of these analyses:

- 1. Select the Chip2Chip icon on the GSEA main page, or select an analysis from the Tools menu. The GSEA page for the selected analysis appears.
- 2. Enter values for the analysis parameters. For parameter descriptions, click *Help*, which displays the Chip2Chip, GSEAPreranked, or CollapseDataset page of this guide.
- 3. Click Run to start the analysis.
- 4. Track analysis progress, as described in Tracking Analysis Progress.
- 5. View analysis results, as described in Viewing Analysis Results.

Tracking Analysis Progress

When you start an analysis, the gene set enrichment analysis or any other analysis, the Processes area shows the analysis as running (blue). When the analysis is finished, it shows the analysis has succeeded (green). If an error occurs, it shows an error message (red). When you exit from GSEA, the Processes area is cleared.



- 1. Click Success to display analysis results in a web browser.
- 2. Click *Error* to display the error report. If you need help resolving the error, send a description of the problem and the text of this error report to gsea@broadinstitute.org.
- 3. Click *Running* to interrupt an analysis. The Thread Control window appears. From this window, you change the amount of CPU that the analysis is using or pause the analysis.



- 4. Click the analysis name to display the parameters used for the analysis. GSEA displays a page similar to the one you used to initially run the analysis. From this page, you can re-run the same analysis or modify the parameters to run a different analysis.
- 5. Click the status bar at the bottom of the window to display the execution log file.

Rerunning an Analysis

To rerun an analysis:

- 1. From the Analysis History page, display the analysis that you want to re-run.
- If you want to reload the data for this analysis, check that the Load Data box is selected.

An analysis can only be run on data that you have loaded during the current session (see Loading Data). If you have not yet loaded the data from this analysis and this is the data that you want to analyze, reload it. If you have already loaded the data, or you want to rerun the analysis with other data that you have already loaded, you do not need to reload data.

3. Click Show in ToolRunner.

GSEA displays a page similar to the one you used to initially run the analysis. From this page, you can leave the parameters unchanged to re-run the same analysis against the same data, or you can modify the parameters.

Note: When you analyze multiple gene sets, you must correct for multiple hypotheses testing. GSEA does this using sample permutation. Because of the random numbers used for sample permutation, when you rerun an analysis using the same data files and parameters, your results will be similar but not identical. Similarly, changing the order of the phenotypes does not affect analysis results, however, if you change the order of the phenotypes and rerun the analysis, your results will be similar but not identical because of the random numbers used for sample permutation.

Viewing Analysis Results

When an analysis completes, GSEA updates the Processes area to show an analysis status of *Success*. To view the analysis results in a web browser, click the *Success* status.

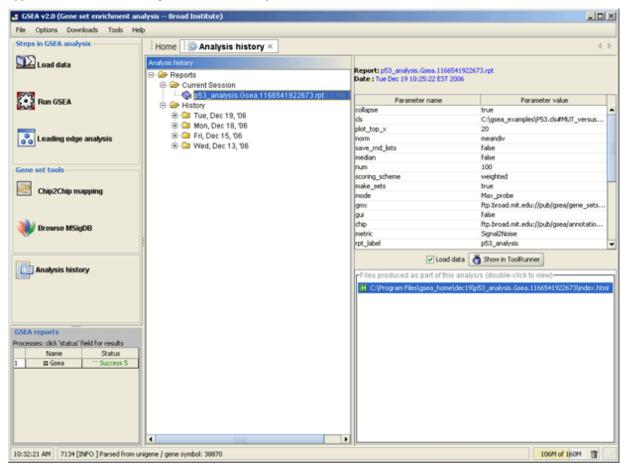
Alternatively, you can use the Analysis History page to view the results of any previously run analysis:

- Displaying the Analysis History Page
- Setting the Default Output Folder
- Sharing Analysis Results
- Deleting Analysis Results

Displaying the Analysis History Page

To display the Analysis History page, click the Analysis history icon in the GSEA main window. The Analysis History page displays all analysis results. The left side of the page lists analyses that you have run, organized by date. Select an analysis to display its parameters and generated files on the right.

To view analysis results, double-click the index.html file generated by the analysis. GSEA displays the results file in a web browser. Alternatively, select any file produced as part of the analysis and then right-click in the area. From the menu that appears, select the tool that you want to use to open the file.



Setting the Default Output Folder

The Analysis History page displays all analysis results that are in the default output folder (*Help>Show GSEA output folder*). Your analysis results are in this folder unless you have taken one of the following actions:

- When you run an analysis, you can choose a location for the analysis results. If you chose an output folder, the analysis results are stored in that folder rather than in the default output folder.
- You can change the folder used as the default output folder by selecting Options>Preferences (see Preferences Window).
 If you changed the default output folder, analysis results stored in the original output folder are still in that folder unless you moved them.

The default output folder contains a subfolder named with today's date (mmmdd). When you run an analysis, by default, GSEA creates a report subfolder in today's output folder and writes all analysis results to that report subfolder. The report subfolder contains:

- the analysis report (index.html)
- the files linked to that report
- a subfolder named edb that contains a machine-readable version of the report

Sharing Analysis Results

To share analysis results with a colleague:

- 1. Select Help>Show GSEA output folder. GSEA displays the default reports output folder in a file browser.
- 2. Locate the report subfolder for the analysis whose results you want to share.
- 3. Create a copy of that folder for your colleague. The analysis report (index.html) and the links to related files are preserved when you copy the folder.

Alternatively, when you run a gene set enrichment analysis, you can use the *Make a zipped file with all reports* parameter to create a zip file that contains the analysis results. If you chose to do so, you can share the analysis results by sending the zip file to your colleague. The zip file is saved in the report subfolder with all of the other analysis results.

Deleting Analysis Results

When GSEA writes analysis results to an output folder, it also creates a matching .rpt file in the gsea_home/reports_cache folder (*Help>Show gsea home folder*). The Analysis History page displays analysis results based on the .rpt files.

To delete analysis results:

- 1. Locate the matching .rpt file in the <code>gsea_home/reports_cache</code> folder. This file lists the analysis parameters and the full path name of the report output folder.
- 2. To delete the analysis results, delete the report output folder listed in the .rpt file.
- 3. To remove the analysis results from the Analysis History page, delete the .rpt file from the gsea_home/reports_cache folder. To update the Analysis History page, restart GSEA.

Interpreting GSEA Results

This section discusses the results of the gene set enrichment analysis:

- GSEA Statistics
- GSEA Report

GSEA Statistics

GSEA computes four key statistics for the gene set enrichment analysis report:

- Enrichment Score (ES)
- Normalized Enrichment Score (NES)
- False Discovery Rate (FDR)
- Nominal P Value

Enrichment Score (ES)

The primary result of the gene set enrichment analysis is the enrichment score (ES), which reflects the degree to which a gene set is overrepresented at the top or bottom of a ranked list of genes. GSEA calculates the ES by walking down the ranked list of genes, increasing a running-sum statistic when a gene is in the gene set and decreasing it when it is not. The magnitude of the increment depends on the correlation of the gene with the phenotype. The ES is the maximum deviation from zero encountered in walking the list. A positive ES indicates gene set enrichment at the top of the ranked list; a negative ES indicates gene set enrichment at the bottom of the ranked list.

In the analysis results, the enrichment plot provides a graphical view of the enrichment score for a gene set:

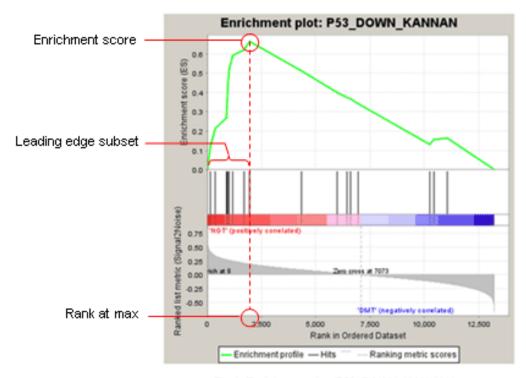


Fig 1: Enrichment plot: P53_DOWN_KANNAN
Profile of the Running ES Score & Positions of GeneSet Members on the Rank Ordered List

- The top portion of the plot shows the running ES for the gene set as the analysis walks down the ranked list. The score at the peak of the plot (the score furthest from 0.0) is the ES for the gene set. Gene sets with a distinct peak at the beginning (such as the one shown here) or end of the ranked list are generally the most interesting.
- The middle portion of the plot shows where the members of the gene set appear in the ranked list of genes.

The **leading edge subset** of a gene set is the subset of members that contribute most to the ES. For a positive ES (such as the one shown here), the leading edge subset is the set of members that appear in the ranked list prior to the peak score. For a negative ES, it is the set of members that appear subsequent to the peak score.

• The bottom portion of the plot shows the value of the ranking metric as you move down the list of ranked genes. The ranking metric measures a gene's correlation with a phenotype. The value of the ranking metric goes from positive to negative as you move down the ranked list. A positive value indicates correlation with the first phenotype and a negative value indicates correlation with the second phenotype. For continuous phenotypes (time series or gene of interest), a positive value indicates correlation with the phenotype profile and a negative value indicates no correlation or inverse correlation with the profile.

Note: By default, the ranking metric is the signal-to-noise ratio. To have GSEA rank the genes based on a different metric, use the *Metric for ranking genes* parameter of the Run GSEA Page. To have GSEA analyze a ranked list of genes that you have created, use the GSEAPreranked Page.

Normalized Enrichment Score (NES)

The normalized enrichment score (NES) is the primary statistic for examining gene set enrichment results. By normalizing the enrichment score, GSEA accounts for differences in gene set size and in correlations between gene sets and the expression dataset; therefore, the normalized enrichment scores (NES) can be used to compare analysis results across gene sets. GSEA determines NES as follows:

$$NES = \frac{\text{actual ES}}{\text{mean}(ESs \text{ against all permutations of the dataset})}$$

NES is based on the gene set enrichment scores for all dataset permutations; therefore, changing the permutation method, the number of permutations, or the size of the expression dataset affects the NES. As an example, consider two analyses: (1) you analyze an expression dataset, GSEA generates a ranked list and analyzes that ranked list; (2) you use GSEAPreranked to analyze the ranked list generated by the first analysis. If you use the same parameter settings, your enrichment scores are identical; however, the normalized enrichment scores reflect the very different datasets (the expression dataset versus the ranked list of genes) used for the permutations:

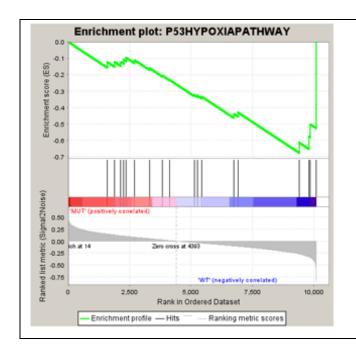
	Expression	Dataset	Ranked List		
Gene Set Name	ES	NES	ES	NES	
BRENTANI_DNA_MET_AND_MOD	0.1233649	0.37071982	0.1233649	0.42405358	
BRCA_BRCA1_NEG	0.13040805	0.6497973	0.13040808	0.6497975	
PENG_RAPAMYCIN_DOWN	0.14286387	0.84542555	0.14286387	0.76681024	
BASSO_REGULATORY_HUBS_SET	0.14299561	0.6870111	0.14299563	0.69177157	
VENTRICLES_UP	0.14565612	0.7033464	0.14565612	0.6915998	
ALANINE_AND_ASPARTATE_METABOLISM	0.14693332	0.422703	0.14693332	0.36949828	
BRCA1_OVEREXP_DN	0.15077576	0.7929205	0.15077576	0.68026066	

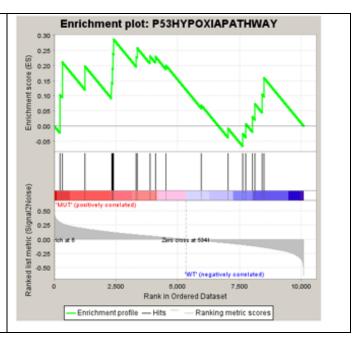
Analysis parameters: P53_hgu95av2.gct, P53.cls#MUT_versus_WT, c2.may_2006.symbols.gmt, permutation type = gene_set, seed for permutation = 149, number of permutations = 10

False Discovery Rate (FDR)

The false discovery rate (FDR) is the estimated probability that a gene set with a given NES represents a false positive finding. For example, an FDR of 25% indicates that the result is likely to be valid 3 out of 4 times. The GSEA analysis report highlights enrichment gene sets with an FDR of less than 25% as those most likely to generate interesting hypotheses and drive further research, but provides analysis results for all analyzed gene sets. In general, given the lack of coherence in most expression datasets and the relatively small number of gene sets being analyzed, an FDR cutoff of 25% is appropriate. However, if you have a small number of samples and use gene_set permutation (rather than phenotype permutation) for your analysis, you are using a less stringent assessment of significance and would then want to use a more stringent FDR cutoff, such as 5%.

The FDR is a ratio of two distributions: (1) the actual enrichment score versus the enrichment scores for all gene sets against all permutations of the dataset and (2) the actual enrichment score versus the enrichment scores of all gene sets against the actual dataset. For example, if you analyze four gene sets and run 1000 permutations, the first distribution contains 4000 data points and the second contains 4. For an example of what the enrichment score for a permutation of the dataset might look like, consider the two enrichment plots shown below. The plot on the left shows actual enrichment results for the P53HYPOSIAPATHWAY gene set against the P53 dataset. The plot on the right shows enrichment results for that gene set against a phenotype permutation of the dataset (that is, when phenotype labels are randomly assigned to the samples).





Generally speaking, the larger the absolute NES the smaller the FDR; that is, as the absolute NES decreases the corresponding FDR increases. However, because the distribution curves tend to be "bumpy" at the tails, you may notice exceptions to this in your GSEA results. For similar reasons, although FDR is less conservative than FWER, you may notice instances in the GSEA results where the FWER is less than FDR.

The Gene Set Enrichment Analysis PNAS paper describes the FDR statistic in the section titled Appendix: Mathematical Description of Methods. For a more detailed discussion of the FDR, including a comparison with the more conservative familywise-error rate (FWER) statistic, see Benjamini and Hochberg (1995).

Nominal P Value

The nominal p value estimates the statistical significance of the enrichment score for a single gene set. However, when you are evaluating multiple gene sets, you must correct for gene set size and multiple hypothesis testing. Because the p value is not adjusted for either, it is of limited value when comparing gene sets. The Gene Set Enrichment Analysis PNAS paper describes the p value statistic in the section titled Appendix: Mathematical Description of Methods.

The FDR is adjusted for gene set size and multiple hypotheses testing while the p value is not. When a top gene set has a small nominal p value and a high FDR value, it generally indicates that it is not as significant when compared with other gene sets in the empirical null distribution. This could be because you do not have enough samples, the biological signal is subtle, or the gene sets do not represent the biology in question very well. On the other hand, the FDR is based on two distributions of all gene sets; if only one of many gene sets is enriched, that gene set is likely to have a high FDR. Finally, a top gene set with a high nominal p value and a low FDR value, generally indicates a negative result: the gene set itself is not significant and other sets are weaker.

In the GSEA report, a p value of zero (0.0) indicates an actual p value of less than 1/number-of-permutations. For example, if the analysis performed 100 permutations, a reported p value of 0.0 indicates an actual p value of less than 0.01. For a more accurate p value, increase the number of permutations performed by the analysis. Typically, you will want to perform 1000 permutations (phenotype or gene_set). (If you attempt to perform significantly more than 1000 permutations, GSEA may run out of memory.)

GSEA Report

This section discusses the content of the report generated by the gene set enrichment analysis:

- Enrichment in Phenotype
- Dataset Details
- Gene Set Details
- Gene Markers
- Global Statistics and Plots
- Other
- Detailed Enrichment Results
- Gene Set Details Report

Enrichment in Phenotype

Enrichment in phenotype: NGT (17 samples)

- . 712 / 1262 gene sets are upregulated in phenotype NGT
- 4 gene sets are significant at FDR < 25%
- 14 gene sets are significantly enriched at nominal pvalue < 1%
- . 35 gene sets are significantly enriched at nominal pvalue < 5%
- · Snapshot of enrichment results
- · Detailed enrichment results in html format
- . Detailed enrichment results in excel format (tab delimited text)
- Guide to interpret results

The analysis report contains two "Enrichment in Phenotype" sections. The first section shows results for gene sets that have a positive enrichment score (gene sets that show enrichment at the top of the ranked list) and the second section shows results for gene sets that have a negative enrichment score (gene sets that show enrichment at the bottom of the ranked list). For categorical phenotypes, a positive enrichment score indicates correlation with the first phenotype and a negative enrichment score indicates correlation with the second phenotype. For continuous phenotypes (time series or gene of interest), a positive value indicates correlation with the phenotype profile and a negative value indicates no correlation or inverse correlation with the phenotype profile.

For each phenotype, the report shows:

- Number of gene sets enriched in this phenotype and the total number of gene sets analyzed.
- Number of enriched gene sets that are significant, as indicated by a false discovery rate (FDR) of less than 25%.
 Typically, these are the gene sets most likely to generate interesting hypotheses and drive further research.
- Number of enriched gene sets with a nominal p value of less than 1% and of less than 5%. The nominal p value is not adjusted for gene set size or multiple hypothesis testing; therefore, it is of limited value for comparing gene sets.
- Snapshot of top results. Displays enrichment plots for the gene sets with the highest absolute normalized enrichment scores. By default, GSEA displays plots for the top 20 gene sets. To display a different number of plots, use the *Plot* graphs for the top sets of each phenotype parameter on the Run GSEA Page. For a description of the enrichment plot, see Enrichment Score (ES).
- Detailed enrichment results provide a summary report of gene sets enriched in this phenotype (html and excel formats).
- Guide to interpret results displays this section of the documentation.

The number of enriched gene sets depends on the structure of the data and the problem space. In general, one would expect to see at least a few gene sets enriched for a typical morphological or tissue-specific phenotype. If no enriched gene sets or a very large number of enriched gene sets pass the FDR threshold, first check that your gene sets and expression dataset use the same array format (see Consistent Feature Identifiers Across Data Files) and that you have used the appropriate permutation type and number of permutations (see the Run GSEA Page). If you find no issues, consider the following:

- No enriched gene sets of significance may indicate that, in fact, no gene sets are enriched. It may also be that you are analyzing too few samples, the biological signal in question is subtle, or the gene sets that you are analyzing do not represent the biology in question very well. You may still want to look at the top ranked gene sets, keeping in mind that these results provide weak evidence for potentially interesting hypotheses. You might also want to consider analyzing other gene sets or, if possible, additional samples.
- Too many enriched gene sets of significance may indicate that, in fact, many gene sets are enriched between phenotypes. Perhaps the gene sets represent the same biological signal. You can check for this by looking for overlap in the leading-edge subsets within the gene sets (see Running a Leading Edge Analysis). Or, you might be seeing significant differences between the phenotypes due to technical artifacts, such as samples being run in different labs, by different operators, or against different arrays. As with too few enriched gene sets, you may still want to look at the top ranked gene sets, keeping in mind that these results provide potentially biased evidence for interesting hypotheses. You might also want to consider analyzing other gene sets or, if possible, additional samples.

Dataset Details

Dataset details

- . The dataset has 22283 native features
- · After collapsing features into gene symbols, there are: 13226 genes

The Dataset Details section of the analysis report provides information about the expression dataset:

• Number of features (genes or probes) in the dataset.

Number of genes in the dataset after collapsing each probe set into a gene (as shown above) or a note indicating that the
probe sets were not collapsed (as shown below). For more information, see the Collapse dataset to gene symbols
parameter on the Run GSEA Page.

Dataset details

- · The dataset has 22283 features (genes)
- No probe set => gene collapsing was requested, so all 22283 features were used

Gene Set Details

Gene set details

- . Gene set size filters (min=15, max=500) resulted in filtering out 12 / 78 gene sets
- . The remaining 66 gene sets were used in the analysis
- . List of gene sets used and their sizes (restricted to features in the specified dataset)

The Gene Set Details section of the analysis report provides information about the gene sets:

- Number of gene sets filtered out of the analysis due to size, and the minimum and maximum gene set sizes used for the filter.
- Number of gene sets used in the analysis.
- List of analyzed gene sets. For each gene set, the report shows the original number of genes in the gene set, the number
 of genes in the gene set after filtering out those genes not in the expression dataset, and the status of the gene set.
 Status is either blank (the gene set was included in the analysis) or "Rejected" (the gene set was filtered out of the
 analysis).

Note: If all gene sets are filtered out, the analysis fails. Typically, this occurs for one of the following reasons:

- The feature identifiers used for the expression dataset do not match those used in the gene sets. For example, your expression dataset contains probe identifiers from the HG_U133A chip and your gene sets identify genes based on HUGO gene symbols. For more information, see Consistent Feature Identifiers Across Data Files.
- After filtering out those genes not in the expression dataset, all of the gene sets are either larger than the maximum or smaller than the minimum gene set size allowed. You can use the Max Size and Min Size parameters on the Run GSEA Page to change the maximum and minimum gene set size.

Gene Markers

Gene markers for the NGT versus DMT comparison

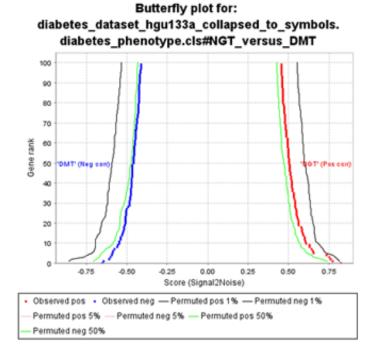
- · The dataset has 13226 features (genes)
- # of markers for phenotype NGT: 7073 (53.5%) with correlation area 54.1%
- . # of markers for phenotype DMT: 6153 (46.5%) with correlation area 45.9%
- . Detailed rank ordered gene list for all features in the dataset
- · Heat map and gene list correlation profile for all features in the dataset
- · Buttefly plot of significant genes

The Gene Markers section of the analysis report provides information about the ranked list of genes used for the analysis:

- Number of features (genes or probes) in the dataset.
- Number of markers for each phenotype in the dataset; that is, the number of genes correlated with each phenotype. The
 bottom portion of the enrichment plot presents a graphical view of this information. For a description of the enrichment
 plot, see Enrichment Score (ES).
- Rank ordered list of genes in the dataset (Excel format), which includes the following information for each gene: probe, description, gene symbol, gene title, and rank metric score. The columns in this table are similar to those in the Gene Set Details Report.
- Heat map of the top 50 features for each phenotype and a plot showing the correlation between the ranked genes and the
 phenotypes. In a heat map, expression values are represented as colors, where the range of colors (red, pink, light blue,
 dark blue) shows the range of expression values (high, moderate, low, lowest).
- Butterfly plot showing the positive and negative correlation between gene rank and the ranking metric score. By default, the butterfly plot shows the top 100 genes; that is, the first and last 100 genes in the ranked list. You can use the *Number* of markers parameter on the Run GSEA Page to change the number of genes displayed.

The bottom portion of the enrichment plot shows the observed correlation between gene rank and the ranking metric score for all genes in the ranked list. The butterfly plot shows the observed correlation, as well as permuted (1%, 5%,

50%) positive and negative correlation, for the top genes. The butterfly plot offers one way to visualize the extent to which dataset permutations change the correlation between gene rank and the ranking metric score.



Global Statistics and Plots

Global statistics and plots

- Plot of p-values vs. NES
- Global ES histogram

The Global Statistics and Plots section provides additional information about the gene sets and enrichment results:

- Plot of p values versus normalized enrichment scores, which provides a quick, visual way to grasp the number of enriched gene sets that are significant.
- Histogram of enrichment scores across gene sets, which provides a quick, visual way to grasp the number of enriched gene sets.

Other

Other

· Parameters used for this analysis

The final section of the report, Other, lists the analysis parameters. Knowing the parameters is critical for reproducing analysis results.

Detailed Enrichment Results

From the Enrichment in Phenotype section of the analysis report, you can click a link to display the detailed enrichment results report, which lists all gene sets enriched in this phenotype ordered by the normalized enrichment score (NES):

Table: Gene sets enriched in phenotype NGT (17 samples) [plain text format]

	GS follow link to MSigDB	GS DETAILS	SIZE	ES	NES	NOM p-val	FDR q-val	FWER p-val	RANK AT MAX	LEADING EDGE
1	P53 DOWN KANNAN	Details	17	0.67	1.95	0.000	0.017	1.000	1953	tags=53%, list=15%, signal=62%
2	ELECTRON TRANSPORT CHAIN	Details	81	0.61	1.76	0.027	0.059	1.000	3047	tags=59%, list=23%, signal=77%

GS	Gene set name. Click the gene set name for a detailed description of the gene set. For MSigDB gene sets, the description is the gene set page on the GSEA web site. For other gene sets, the description is provided by the author of the gene set.
GS DETAILS	For the top 20 gene sets, click the Details link to display the Gene Set Details Report. To generate the Details link for a different number of gene sets, use the <i>Plot graphs for the top sets of each phenotype</i> parameter on the Run GSEA Page.
SIZE	Number of genes in the gene set after filtering out those genes not in the expression dataset
ES	Enrichment score for the gene set; that is, the degree to which this gene set is overrepresented at the top or bottom of the ranked list of genes in the expression dataset.
NES	Normalized enrichment score; that is, the enrichment score for the gene set after it has been normalized across analyzed gene sets.
NOM p-value	Nominal p value; that is, the statistical significance of the enrichment score. The nominal p value is not adjusted for gene set size or multiple hypothesis testing; therefore, it is of limited use in comparing gene sets.
FDR q-value	False discovery rate; that is, the estimated probability that the normalized enrichment score represents a false positive finding.
FWER p-value	Familywise-error rate; that is, a more conservatively estimated probability that the normalized enrichment score represents a false positive finding. Because the goal of GSEA is to generate hypotheses, the GSEA team recommends focusing on the FDR statistic.
RANK AT MAX	The position in the ranked list at which the maximum enrichment score occurred. The more interesting gene sets achieve the maximum enrichment score near the top or bottom of the ranked list; that is, the rank at max is either very small or very large.
LEADING EDGE	Displays the three statistics used to define the leading edge subset:
	Tags. The percentage of gene hits before (for positive ES) or after (for negative ES) the peak in the running enrichment score. This gives an indication of the percentage of genes contributing to the enrichment score.
	List. The percentage of genes in the ranked gene list before (for positive ES) or after (for negative ES) the peak in the running enrichment score. This gives an indication of where in the list the enrichment score is attained.
	Signal. The enrichment signal strength that combines the two previous statistics:
	$(\text{Tag }\%)(1-\text{Gene }\%)\left(\frac{N}{N-Nh}\right)$
	where <i>N</i> is the number of genes in the list and <i>Nh</i> is the number of genes in the gene set. If the gene set is entirely within the first <i>Nh</i> positions in the list, then the signal strength is maximal or 100%. If the gene set is spread throughout the list, then the signal strength decreases towards 0%.
	These statistics describe the leading-edge subset of a single gene set. Use the Leading Edge analysis to analyze the overlap between multiple leading-edge subsets.

Gene Set Details Report

From the Detailed Enrichment Results table, click the Details link for a gene set to display a Gene Set Details report that contains the following:

- A table showing the GSEA results for this gene set. The fields in this table are similar to those in the Detailed Enrichment Results.
- An enrichment plot for this gene set, as described in Enrichment Score (ES).
- A table of genes in the gene set ordered by their position in the ranked list of genes. The analysis includes only those genes in the gene set that are also in the expression dataset. To display the table in Excel, click the plain text format link in the table header.

Table: GSEA details [plain text format]

	PROBE	GENE SYMBOL	GENE_TITLE	RANK IN GENE LIST	RANK METRIC SCORE	RUNNING ES	CORE ENRICHMENT
1	II ANI AA		ADP-ribosylation factor-like 4A	27	0.414	0.2171	Yes
2	ILCXADD.		coxsackie virus and adenovirus receptor	296	0.286	0.3396	Yes

PROBE	Probe used for the gene. When possible, the probe name links to probe information.
DESCRIPTION	Gene description supplied in the expression dataset file. This column appears only if you choose to run the analysis without collapsing each probe set to a gene; that is, if you set the <i>Collapse dataset to gene symbols</i> parameter to False on the Run GSEA Page.
GENE SYMBOL	Gene name. If you specify a chip annotation file, the report includes the gene symbol name with links to external databases that provide gene information.
GENE TITLE	Brief description of the gene from the chip annotation file.
RANK IN GENE LIST	Position of the gene in the ranked list of genes.
RANK METRIC SCORE	Score used to position the gene in the ranked list.
RUNNING ES	Running enrichment score; that is, the enrichment score at this point in the ranked list of genes.
CORE ENRICHMENT	Genes with a Yes value in this column contribute to the leading-edge subset within the gene set. This is the subset of genes that contributes most to the enrichment result. Use the Leading Edge analysis to analyze the overlap between multiple leading-edge subsets.

- A heat map of the genes in the gene set. In a heat map, expression values are represented as colors, where the range of colors (red, pink, light blue, dark blue) shows the range of expression values (high, moderate, low, lowest).
- A histogram of the enrichment scores for all permutations. The actual enrichment score for the gene set is shown in the figure title.

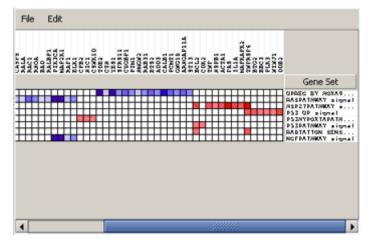
Interpreting Leading Edge Analysis Results

When you click *Run leading edge analysis* on the Leading Edge Analysis Page, GSEA displays four graphs that help you visualize the overlap between the selected leading edge subsets. When you click *Build HTML Report*, GSEA generates an analysis results report that provides details on the leading edge subsets and the overlap between them. This section describes each graph and then the report:

- Heat Map
- Set-to-Set
- Gene in Subsets
- Histogram
- HTML Report

Heat Map

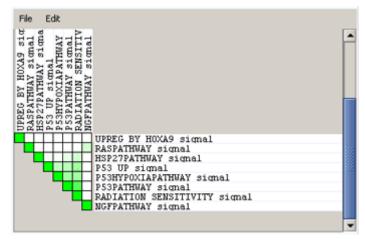
The heat map shows the (clustered) genes in the leading edge subsets. In a heat map, expression values are represented as colors, where the range of colors (red, pink, light blue, dark blue) shows the range of expression values (high, moderate, low, lowest).



- Use the File menu to save the dataset or the heat map image.
- Use the Edit menu to change the grid size of the heat map. Decrease the grid size to zoom out.
- Hover over a cell to display the associated gene and gene set names.

Set-to-Set

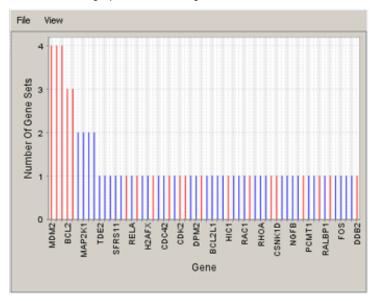
The top right graph uses color intensity to show the overlap between subsets: the darker the color, the greater the overlap between the subsets. Specifically, the intensity of the cell for sets A and B corresponds to an X/Y ratio where X is the number of leading edge genes from set A and Y is the union of leading edge genes in sets A and B. A dark green cell indicates that sets A and B have the same leading edge genes and a white cell indicates that sets A and B have no leading edge genes in common.



- Use the File menu to save the dataset or the image.
- Use the Edit menu to change the grid size of the graph. Decrease the grid size to zoom out.

Gene in Subsets

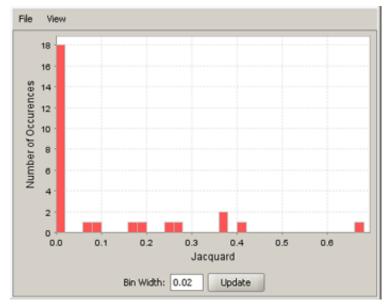
The bottom left graph shows each gene and the number of subsets in which it appears.



- Use the File menu to save or print the image.
- Use the View menu to zoom in, zoom out, or change the look of the graph (add a title, change the label and look of the axes, or the color of the background).

Histogram

The last plot is a histogram, where the Jacquard is the intersection divided by the union for a pair of leading edge subsets. Number of Occurrences is the number of leading edge subset pairs in a particular bin. In this example, most subset pairs have no overlap (Jacquard = 0).



- Use the File menu to save or print the image.
- Use the View menu to zoom in, zoom out, or change the look of the histogram (add a title, change the label and look of the axes, or the color of the background).

HTML Report

The HTML Report for the leading edge analysis contains the following sections:

- Clustered results. Provides the number of gene sets analyzed and a heat map of the leading edge subsets after clustering.
- Details of gene sets. Provides the following information for each of the analyzed gene sets and its leading edge subset:
 - # members. Number of genes in the gene set.
 - # members in signal. Number of genes in the leading edge subset.
 - Tag %. The percentage of gene hits before (for positive ES) or after (for negative ES) the peak in the running
 enrichment score. This gives an indication of the percentage of genes contributing to the enrichment score.
 - List %. The percentage of genes in the ranked gene list before (for positive ES) or after (for negative ES) the peak in the running enrichment score. This gives an indication of where in the list the enrichment score is attained.
 - Signal strength. The enrichment signal strength that combines the two previous statistics:

$$(\text{Tag }\%)(1-\text{Gene }\%)\left(\frac{N}{N-Nh}\right)$$

where *N* is the number of genes in the list and *Nh* is the number of genes in the gene set. If the gene set is entirely within the first *Nh* positions in the list, then the signal strength is maximal or 100%. If the gene set is spread throughout the list, then the signal strength decreases towards 0%.

- Other files made. Provides a heat map of the (unclustered) leading edge subsets and tabular ways of examining the leading edge subsets:
 - Clustered dataset (gct) uses the expression dataset format to describe the clustered leading edge subsets: each row
 is a gene set, each column is a gene, and an "expression value" of 1 indicates the gene is in the leading edge subset
 for the gene set.
 - GeneMatrix (gms) provides a gene set file for the leading edge subsets, which lists each gene set and the genes in its leading edge subset.
 - Dataset (gct) uses the expression dataset format to describe the leading edge subsets (not clustered): each row is a
 gene set, each column is a gene, and an "expression value" of 1 indicates the gene is in the leading edge subset for
 the gene set.
 - Heat map shows a heat map of the leading edge subsets (not clustered).
- Other. Lists the analysis parameters. Knowing the parameters used to produce the analysis is critical for reproducible research.

Running GSEA from the Command Line

Typically, you run GSEA software using the GSEA desktop application; however, you can also run GSEA software from the command line. This can be useful, for example, when you want to analyze several datasets at once or analyze a large dataset or a large number of gene sets on a server or compute cluster.

- Syntax
- Output
- Examples

Syntax

To run GSEA from the command line, use a java command of the form:

java -cp full-path/gsea2.jar -Xmx512m gsea-tool parameters

-cp	Points the CLASSPATH variable to the complete path of the gsea2.jar file. You do not need to set any other CLASSPATH variables.				
	For Broad internal users, the latest .jar file is available at /xchip/projects/xtools/gsea2.jar.				
-Xmx512m	Specifies the amount of memory available to Java. When increasing memory, try doubling the default value to 1024m.				
	For 32-bit machines, GSEA has been successfully used with 2500m; for 64-bit machines, GSEA has been successfully used with 5000m; for Windows and linux 32-bit, the maximum appears to be 1800m.				
gsea-tool	Specifies the analysis to use; for example, specify xtools.gsea.Gsea to run the gene set enrichment analysis. To find the tool name for an analysis, open the GSEA application, display the page that runs the analysis, and click the <i>Command</i> button at the bottom of the page. GSEA displays the command line used to run the analysis.				
	Note: The Leading Edge Analysis Page does not include a <i>Command</i> button; therefore, the command line syntax for building a leading edge HTML report is provided here:				
	java -cp gsea2.jar -Xmx512m xtools.gsea.LeadingEdgeTool -dir path_to_gsea_report_dir -gsets set_names_comma_delimited				
parameters	Specifies the analysis parameters. To find the parameters for an analysis, open the GSEA application, display the page that runs the analysis, enter the parameters that you want to use, and click the <i>Command</i> button at the bottom of the page. GSEA displays the command line used to run the analysis. If you omit a parameter, GSEA uses the default value as displayed in the GSEA application.				
	 Paths to file names must be fully specified or relative to the execution directory. When creating batch files, you generally want to use full path names for all files. 				
	File names are platform-specific and may require editing. For example, on Windows, a file name that contains spaces must be enclosed in quotation marks.				
	 Files cannot be directly accessed from the GSEA ftp site. Download the desired gene set or array annotations files from the GSEA web site (http://www.broadinstitute.org/gsea/downloads.jsp) and reference the downloaded files in the command line. 				
	 Parameter values cannot include hyphens (-); therefore, file names cannot include hyphens. If necessary, change hyphens to underscores. For example, you cannot use -res my-dataset.gct, but must use -res my_dataset.gct instead. 				
	Optionally, use the <code>-param_file</code> parameter to specify a parameter file, which can contain any parameter except <code>-param_file</code> . If you specify the same parameter on the command line and in the parameter file, the value on the command line takes precedence. A parameter file is a text file that defines one parameter per line. Each line contains a parameter name (without the initial hyphen), a tab (not spaces), and the parameter value. For example: <code>GSEAParameters.txt</code> .				

Output

By default, the GSEA command line writes analysis reports to a dated subfolder, *mmmdd*, in the current working directory. To write analysis reports to a different location, use the <code>-out</code> parameter. (GSEA creates the mmmdd subfolder in the current directory, but writes the reports to the specified location.) To specify a report name, rather than using the default name of my_analysis, use the <code>-rpt label</code> parameter.

Note: The GSEA application uses a different graphical imaging package than the GSEA command line; therefore, heat maps generated from the GSEA command line look different from heat maps generated by the GSEA application.

Examples

1. Following is a command line that might appear when you click the Command button in GSEA. To run the command from the command line, you must add the -cp parameter. In this example, the -gmx and -chip parameters reference files on the GSEA ftp site. You must download these files from the GSEA web site (http://www.broadinstitute.org/gsea/downloads.jsp) and update the command line to reference the downloaded files. If necessary, quote file names that include spaces and/or remove hyphens from the file names.

```
java -Xmx512m xtools.gsea.Gsea
-res \Krypton\GSEATest\DataSets\P53_hgu95av2.gct
-cls \Krypton\GSEATest\DataSets\P53.cls#MUT_versus_WT
-gmx ftp.broadinstitute.org://pub/gsea/gene_sets/c1.v2.symbols.gmt
-chip ftp.broadinstitute.org://pub/gsea/annotations/HG_U95Av2.chip
-collapse true -mode Max_probe -norm meandiv -nperm 1000 -permute phenotype
-rnd_type no_balance -scoring_scheme weighted -rpt_label my_analysis
-metric Signal2Noise -sort real -order descending -include_only_symbols true
-make_sets true -median false -num 100 -plot_top_x 20 -rnd_seed timestamp
-save_rnd_lists false -set_max 500 -set_min 15 -zip_report false
-out C:\Program Files\gsea home\dec18 -gui false
```

2. Following is a command line that assumes that the identifiers in your dataset match those in your gene sets:

```
java - Xmx1024m -cp /xchip/projects/xtools/gsea2.jar xtools.gsea.Gsea
-res test.gct -cls test.cls -gmx test.gmx -collapse false
```

3. Following is a command line that assumes that your dataset uses HG_U133A probe identifiers and your gene sets use gene symbols, so you want to collapse your dataset:

```
java -Xmx1024m -cp /xchip/projects/xtools/gsea2.jar xtools.gsea.Gsea
-res foo.gct -cls foo.cls -gmx foo.gmx
-chip ftp.broadinstitute.org://pub/gsea/annotations/HG U133A.chip
```

Quick Reference

This section provides descriptions of the GSEA menu bar and windows:

- Menu Bar
- GSEA Main Window
- Load Data Page
- Run GSEA Page
- Leading Edge Analysis Page
- Chip2Chip Page
- Browse MSigDB Page
- Analysis History Page
- GSEAPreranked Page
- CollapseDataset Page
- Preferences Window

Menu Bar

File

Exit. Closes GSEA. Any analyses still running are stopped when you exit.

Options

- Preferences. Displays the Preferences Window, which allows you to set GSEA configuration options.
- Prompt before closing application. When selected, if you close the GSEA application by clicking the X icon in the upper right corner, GSEA prompts you to confirm that you want to exit the application.
- Connect over the internet. When selected, the Gene sets database and Chip platform(s) parameters (on pages such as
 the Run GSEA page) displays data files available on the Broad ftp site. If you are working offline, clear this option to
 disable this feature and avoid a time-consuming attempt to connect to the internet.
- Use median instead of mean for metrics. Changes the default value of the Median for class metrics parameter on the Run GSEA page, which changes the Metrics for Ranking Genes. If you change this option, the new default value takes effect when you restart GSEA. By default, this option is not selected.
- Fix metrics for low variance. When calculating the ranking metrics, as described in Metrics for Ranking Genes, the denominator may be zero (0). A denominator of zero (0) causes an error in the analysis unless this option is selected. By default, this option is selected.
- Use biased variances. When calculating the ranking metrics, as described in Metrics for Ranking Genes, GSEA uses an
 unbiased variance to calculate standard deviation. Select this option to have GSEA use a biased variance instead. By
 default, this option is not selected.
- Clear recent file history. Removes all files from the Recently Used Files pane of the Load Data Page.

Downloads

- Download chip annotations. Displays the DNA chip (array) annotations files available on the GSEA web site.
- Download example datasets. Displays the example datasets available on the GSEA web site.

Tools

- GseaPreranked. Runs the GSEAPreranked analysis.
- CollapseDataset. Runs the CollapseDataset analysis.

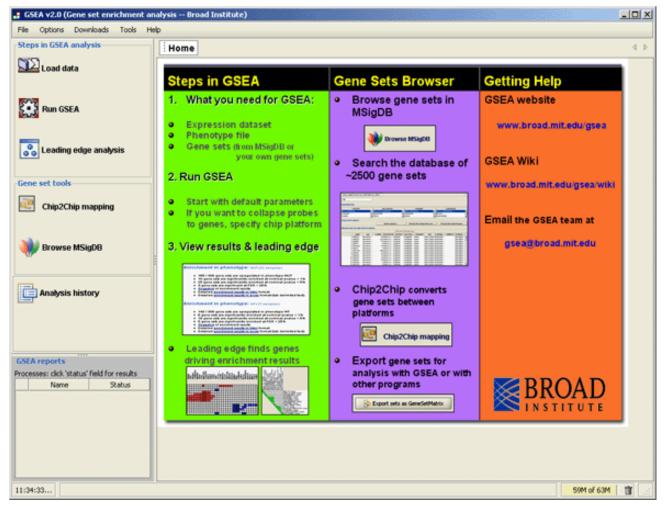
Help

- GSEA web site. Displays the home page of the GSEA web site.
- GSEA documentation. Displays the documentation page of the GSEA web site.

- Show GSEA home folder. Displays the <code>gsea_home</code> folder in a file browser. The <code>gsea_home</code> folder contains the default output folder and the reports cache folder, as described in Viewing Analysis Results.
- Show GSEA output folder. Displays GSEA analysis results, as described in Viewing Analysis Results. By default, GSEA writes analysis results to this folder. To select a different folder, use the Preferences Window.
- Feedback & feature requests. Displays a form that you can use to submit feature requests to the GSEA team. You can use the form or send mail to gsea@broadinstitute.org.
- Credits. Displays information about the people, software, and algorithm underlying GSEA.
- About. Displays detailed systems information for GSEA.
- The final item is GSEA build number and the date of the build. When reporting a problem, you may be asked for this
 information.

GSEA Main Window

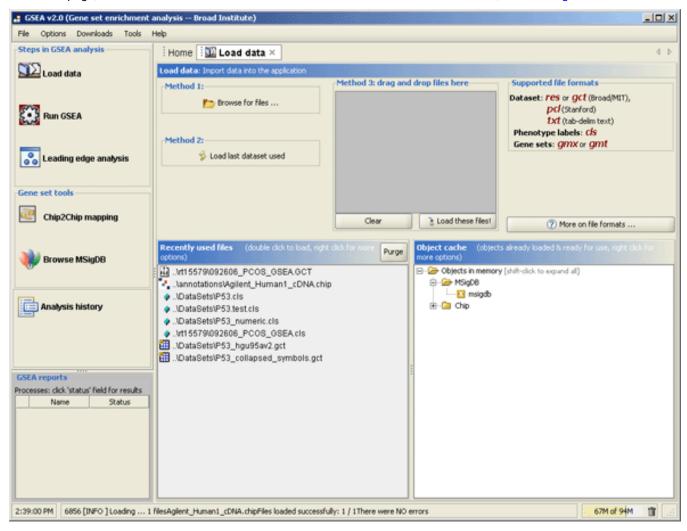
The GSEA main window appears when you start GSEA. The one page open in the window is the Startup page. As you open new pages, tabs appear next to the Startup tab. To close a page, click the close (X) icon on the tab.



- Use the icons on the left for quick access to the primary GSEA operations. For more information, see the pages displayed by each icon:
 - Load Data Page
 - Run GSEA Page
 - Leading Edge Analysis Page
 - Chip2Chip Page
 - Browse MSigDB Page
 - Analysis History Page
- Use the Processes area to track the status of analyses that you run, as described in Tracking Analysis Progress.
- For descriptions of the menu bar items, see Menu Bar.

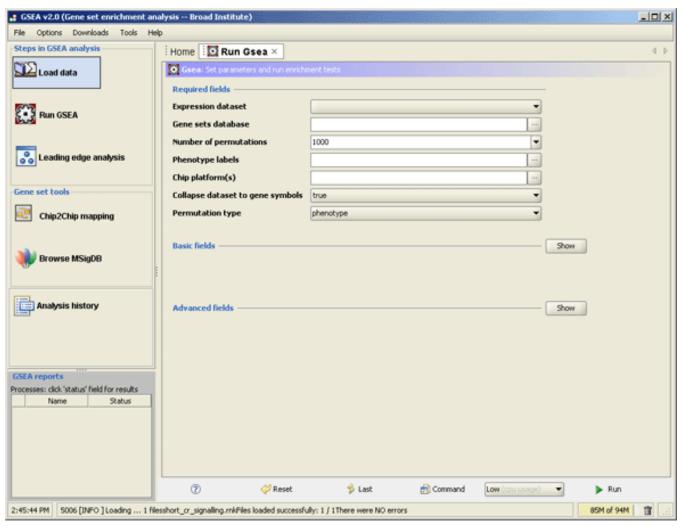
Load Data Page

Use the Load Data page to load data files into GSEA. You must load data files before you can analyze them. To display the Load Data page, select the Load Data icon in the GSEA main window. For more information, see Loading Data.



Run GSEA Page

Use the Run GSEA page to run the gene set enrichment analysis. To display this page, click the Run GSEA icon in the GSEA main window.



Place your cursor on a parameter name to see a brief description of the parameter.

Required Fields lists parameters that are essential for the analysis. Enter values for these parameters before starting the analysis.

- Expression dataset. Select an expression dataset from the drop-down list. If the dataset is not listed, you have not yet loaded it; see Loading Data.
- Gene sets database. Click the ellipse (...) button and select one or more gene sets:
 - GeneMatrix (from website) lists the MSigDB gene sets available on the Broad ftp site. These gene set files may
 contain hundreds of gene sets. Use the Browse MSigDB Page to browse the gene sets and to create gene set files
 (gmx/gmt) containing only gene sets of interest.
 - GeneSets(grp) lists gene sets that GSEA has created in memory; for example, gene sets created using the Text Entry tab described below.
 - GeneMatrix (local gmx/gmt) lists the gene set files that you have loaded (see Loading Data).
 - Subsets lists each gene set in each gmx/gmt file that you have loaded.
 - Text Entry allows you to create a gene set by entering the genes for that gene set; enter one gene per line. The gene
 set is created in memory and deleted when you exit from GSEA.
- Number of permutations. Specify the number of permutations to perform in assessing the statistical significance of the
 enrichment score. It is best to start with a small number, such as 10. After the analysis completes successfully, run it
 again with a full set of permutations. The GSEA team recommends 1000 permutations.

- Phenotype labels. Click the ellipse (...) button to display the Select a Phenotype Window, which allows you to select a
 phenotype to analyze.
- Chip platform(s). Click the ellipse (...) button and select one or more DNA chip (array) annotation files:
 - Chips (from website) lists the chip annotation files available on the Broad ftp site.
 - Chips (local .chip) lists the chip annotation files that you have loaded (see Loading Data).

This parameter is mandatory or optional depending on the value of the Collapse dataset to gene symbols parameter.

- Collapse dataset to gene symbols:
 - Select True (default) to have GSEA collapse each probe set in the expression dataset into a single vector for the
 gene, which gets identified by its HUGO gene symbol. When you select True, you must specify a chip annotation file
 (Chip platform parameter) and gene sets (Gene sets database parameter) that identify genes by HUGO gene symbol.
 - Select False to use your expression dataset as is (with its native feature identifiers). When you select this option, the
 chip annotation file (*Chip platform* parameter) is optional and you must specify gene sets (*Gene sets database*parameter) that identify genes using the same feature (gene or probe) identifiers as those used in your expression
 dataset.

For more information, see Consistent Feature Identifiers Across Data Files.

- Permutation type. Select the type of permutation to perform in assessing the statistical significance of the enrichment score:
 - Phenotype. Random phenotypes are created by shuffling the phenotype labels on the samples. For each random phenotype, GSEA ranks the genes and calculates the enrichment score for all gene sets. These enrichment scores are used to create a null distribution from which the significance of the actual enrichment score (for the actual expression data and gene set) is calculated. This is the recommended method when there are at least seven (7) samples in each phenotype.
 - Gene_set. Random gene sets, size matched to the actual gene set, are created and their enrichment scores calculated. These enrichment scores are used to create a null distribution from which the significance of the actual enrichment score (for the actual gene set) is calculated. This method is useful when you have too few samples to do phenotype permutations (that is, when you have fewer than seven (7) samples in any phenotype).

The GSEA team recommends using phenotype permutation whenever possible. The phenotype permutation shuffles the phenotype labels on the samples in the dataset; it does not modify gene sets. Therefore, the correlations between the genes in the dataset and the genes in a gene set are preserved across phenotype permutations. The gene_set permutation creates random gene sets; therefore, the correlations between the genes in the dataset and the genes in the gene set are not preserved across gene_set permutations. Preserving the gene-to-gene correlation across permutations provides a more biologically reasonable (more stringent) assessment of significance.

Note: In previous versions of GSEA, gene_set permutation was referred to as tag permutation.

Basic Fields lists additional parameters with standard defaults. Typically, you use the default values for these parameters. Click *Show/Hide* to display and hide these parameters.

- Analysis name. A short descriptive label for the analysis. The name cannot include spaces. This label is used as a prefix when naming the output report generated by the analysis (for example, my_analysis.Gsea.1130510139575.rpt).
- Enrichment statistic. To calculate the enrichment score, GSEA first walks down the ranked list of genes increasing a running-sum statistic when a gene is in the gene set and decreasing it when it is not. The enrichment score is the maximum deviation from zero encountered during that walk. This parameter affects the running-sum statistic used for the analysis. The last section of the Gene Set Enrichment Analysis PNAS paper shows the mathematical descriptions of the methods used in GSEA. This option controls the value of p used in the enrichment score calculation shown there:
 - classic: p=0
 - weighted (default): p=1
 - weighted_p2: p=2
 - weighted_p1.5: p=1.5
- Metric for ranking genes. GSEA ranks the genes in the expression dataset and then analyzes that ranked list of genes.
 Use this parameter to select the metric used to score and rank the genes; use the Gene list sorting mode parameter to
 determine whether to sort the genes using the real (default) or absolute value of the metric score; and use the Gene list
 ordering mode parameter to determine whether to sort the genes in descending (default) or ascending order. For
 descriptions of the ranking metrics, see Metrics for Ranking Genes.

Note: The default metric for ranking genes is the signal-to-noise ratio. To use this metric, your phenotype file must define at least two categorical phenotypes and your expression dataset must contain at least three (3) samples for each phenotype. If you are using a continuous phenotype or your expression dataset contains fewer than three samples per phenotype, you must choose a different ranking metric. If your expression dataset contains only one sample, you must

rank the genes and use the GSEAPreranked Page to analyze the ranked list; none of the GSEA metrics for ranking genes can be used to rank genes based on a single sample.

- Gene list sorting mode. GSEA ranks the genes in the expression dataset and then analyzes that ranked list of genes. Use this parameter to determine whether to sort the genes using the real (default) or absolute value of the ranking metric.
- Gene list ordering mode. GSEA ranks the genes in the expression dataset and then analyzes that ranked list of genes.
 Use this parameter to determine whether to sort the genes in descending (default) or ascending order. Ascending order is usually applicable when the ranking metric is a measure of nearness (how close the genes are to one another) rather than distance.
- Max size. After filtering from the gene sets any gene not in the expression dataset, gene sets larger than this are excluded from the analysis.
- Min size. After filtering from the gene sets any gene not in the expression dataset, gene sets smaller than this are excluded from the analysis.
- Save results in this folder. Path of the directory in which to place the analysis results. Existing results in this folder are not
 overwritten. By default, analysis results are saved in the GSEA output folder. To view this folder, select Help>Show GSEA
 output folder.

Advanced Fields lists parameters that control details of the GSEA algorithm and its Java implementation. Do not change the default values of these parameters unless you are conversant with the algorithm and its Java implementation. Click *Show/Hide* to display and hide these parameters.

- Collapsing mode for probe sets => 1 gene. Used only when the *Collapse dataset to gene symbols* parameter is set to True. Select the expression values to use for the single probe that will represent all probe sets for the gene:
 - max probe (default): for each sample, use the maximum expression value for the probe set. For example:

Probeset_A	10	20	15	200
Probeset_B	100	105	110	95
gene_symbol_AB	100	105	110	200

- median_of_probes: for each sample, use the median expression value for the probe set.
- Normalization mode. Method used to normalize the enrichment scores across analyzed gene sets:
 - meandiv (default): GSEA normalizes the enrichment scores as described in Normalized Enrichment Score (NES).
 - none: GSEA does not normalize the enrichment scores.
- Randomization mode. Method used to randomly assign phenotype labels to samples for phenotype permutations. Not
 used for gene_set permutations.
 - no_balance (default). Permutes labels without regard to number of samples per phenotype. For example, if your
 dataset has 12 samples in class_a and 10 samples in class_b, any permutation of class_a has 12 samples randomly
 chosen from the dataset.
 - equalize_and_balance. Permutes labels by equalizing the number of samples per phenotype and then balancing the number of samples contributed by each phenotype. For example, if your dataset has 12 samples in class_a and 10 samples in class_b, any permutation of class_a has 10 samples: 5 randomly chosen from class_a and 5 randomly chosen from class_b.

The GSEA team recommends using no_balance (default), unless the number of samples per phenotype is highly unbalanced.

- Omit features with no symbol match. Used only when Collapse dataset to gene symbols is set to True. By default (true),
 the new dataset excludes probes/genes that have no gene symbols. Set to False to have the new dataset contain all
 probes/genes that were in the original dataset.
- Make detailed gene set report. Set to True (default) to create a detailed gene set report for each enriched gene set.
- Median for class metrics. Set to True (default=False) to use the median of each class, instead of the mean, in the metrics
 for ranking for genes. The Use median instead of mean for metrics item in the Options menu controls the default setting
 for this parameter. (If you change the setting in the Options menu, the new default takes effect the next time you start
 GSEA.)
- Number of markers. Number of features (gene or probes) to include in the butterfly plot in the Gene Markers section of the gene set enrichment report.
- Plot graphs for the top sets of each phenotype. Generates summary plots and detailed analysis results for the top x genes in each phenotype, where x is 20 by default. The top genes are those with the largest normalized enrichment scores.

- Seed for permutation. Seed used to generate a random number for phenotype and gene_set permutations: timestamp (default) or 149. The specific seed value (149) generates consistent results, which is useful when testing software.
- Save random ranked lists. Set to True (default=false) to save the random ranked lists of genes created by phenotype
 permutations. When you save random ranked lists, for each permutation, GSEA saves the rank metric score for each
 gene (the score used to position the gene in the ranked list). Saving random ranked lists is memory intensive; therefore,
 this parameter is set to false by default.
- Make a zipped file with all reports. Set to True (default=false) to create a zip file of the analysis results. The zip file is saved to the output folder with all of the other files generated by the analysis. This is useful for sharing analysis results.

Buttons at the bottom of the page:

- Help. Displays this documentation.
- Reset. Restores the default values for all parameters.
- Last. Loads the data used the last time you ran this analysis.
- Command. Displays the command line used to run the analysis, as described in Running GSEA from the Command Line.
- Low/Normal (cpu usage). Determines the amount of CPU dedicated to this analysis. To use your computer for other tasks while running GSEA in the background, choose Low. To complete your analysis more quickly, choose Normal.
- Run. Starts the analysis.

Metrics for Ranking Genes

When you run the gene set enrichment analysis from the Run GSEA Page, GSEA ranks the genes in the expression dataset and then analyzes that ranked list of genes. You use the *Metric for ranking genes* parameter to select the metric used to score and rank the genes; the *Gene list sorting mode* parameter to determine whether to sort the genes using the real (default) or absolute value of the metric score; and the *Gene list ordering mode* parameter to determine whether to sort the genes in descending (default) or ascending order.

This section describes each of the ranking metrics in the drop-down list of the *Metric for ranking genes* parameter. If your favorite metric is not listed here, you can rank the genes in your dataset using that metric and then use the GSEAPreranked Page to analyze your ranked list of genes. If your dataset contains only one sample, GSEA cannot rank the genes; however, you can rank the genes and then use the GSEAPreranked Page to analyze your ranked list of genes.

Three settings on the Options menu affect the calculations shown here:

- Use median instead of mean for metrics. For categorical phenotypes, by default, GSEA calculates differential expression based on the mean expression value for each phenotype. To use the median expression value for each phenotype, set the Median for class metrics parameter on the Run GSEA page to True. To always use the median expression value for each phenotype, use Options>Use median instead of mean for metrics to change the default value of the Median for class metrics parameter. The new default value takes effect when you restart GSEA. By default, this option is not selected.
 Note: Using median rather than mean may cause ties in the ranking.
- Fix metrics for low variance. When calculating ranking metrics, the denominator may be zero (0). A denominator of zero (0) causes an error in the analysis unless this option is selected. By default, this option is selected.
- Use biased variances. When calculating ranking metrics, GSEA uses an unbiased variance to calculate standard deviation. Select this option to have GSEA use a biased variance instead. By default, this option is not selected.

For categorical phenotypes, GSEA determines a gene's mean expression value for each phenotype and then uses one of the following metrics to calculate the gene's differential expression with respect to the two phenotypes. To use median rather than mean expression values, set the *Median for class metrics* parameter to True, as described above.

Signal2Noise (default) uses the difference of means scaled by the standard deviation. Note: You must have at least three
samples for each phenotype to use this metric.

$$\frac{\mu_A - \mu_B}{\sigma_A + \sigma_B}$$

where μ is the mean and σ is the standard deviation; σ has a minimum value of .2 * absolute(μ), where μ =0 is adjusted to μ =1. The larger the signal-to-noise ratio, the larger the differences of the means (scaled by the standard deviations); that is, the more distinct the gene expression is in each phenotype and the more the gene acts as a "class marker."

• tTest uses the difference of means scaled by the standard deviation and number of samples. **Note:** You must have at least three samples for each phenotype to use this metric.

$$\frac{\mu_A - \mu_B}{\sqrt{\frac{\sigma_A^2}{n_A} + \frac{\sigma_B^2}{n_B}}}$$

where μ is the mean, n is the number of samples, and σ is the standard deviation; σ has a minimum value of .2 * absolute(μ), where μ =0 is adjusted to μ =1. The larger the tTest ratio, the more distinct the gene expression is in each phenotype and the more the gene acts as a "class marker."

 Ratio_of_Classes (also referred to as fold change) uses the ratio of class means to calculate fold change for natural scale data:

$$\frac{\mu_A}{\mu_B}$$

where μ is the mean. The larger the fold change, the more distinct the gene expression is in each phenotype and the more the gene acts as a "class marker."

Diff_of_Classes uses the difference of class means to calculate fold change for log scale data:

$$\mu_A - \mu_B$$

where μ is the mean. The larger the fold change, the more distinct the gene expression is in each phenotype and the more the gene acts as a "class marker."

• log2 Ratio of Classes uses the log2 ratio of class means to calculate fold change for natural scale data:

$$\log 2 \left(\frac{\mu_A}{\mu_B}\right)$$

where μ is the mean. This is the recommended statistic for calculating fold change for natural scale data.

For continuous phenotypes, GSEA determines an ideal expression profile based on the phenotype (.cls) file, determines a gene's expression profile based on the expression dataset (.gct) file, and then uses one of the following metrics to calculate the correlation between the two expression profiles. **Note:** You can also use these metrics to analyze categorical phenotypes: in your phenotype labels file, specify the categorical phenotype labels as numbers.

• Pearson uses Pearson's correlation to determine the degree of linear relationship between the two profiles, where +1 indicates a perfect positive relationship, 0 indicates no relationship, and -1 indicates a perfect inverse relationship.

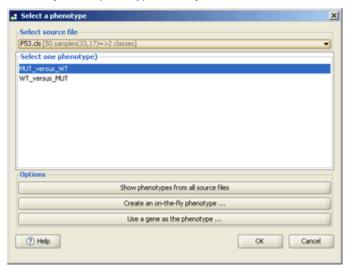
Pearson is the only metric that does not require the two profiles to use the same unit of measure; therefore, **Pearson is the only metric that can be used with a time series phenotype**. For the same reason, of the continuous phenotype metrics, Pearson is the most useful for analyzing categorical phenotypes.

- Cosine is a variant of Pearson's that is defined by Eisen et al. (1998). It is appropriate only when the expression profiles are based on log-expression ratios relative to a control.
- Manhattan measures similarity based on a distance measure, where the distance between two objects is given by the length of a line assuming that you can travel in only one direction at a time (imagine the points are on a grid and you must move vertically and horizontally, rather than diagonally, to move between them).
- Euclidean measures similarity based on a distance measure, where the distance between two objects is the length of a straight line between the objects.

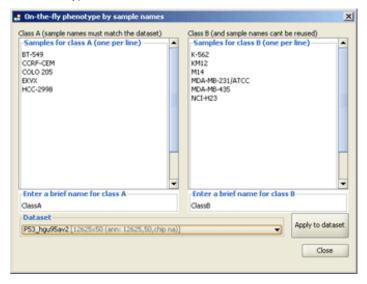
Statistics reference: Statistics for Microarrays, Wit, E. and McClure J., John Wiley & Sons Ltd., 2004.

Select a Phenotype Window

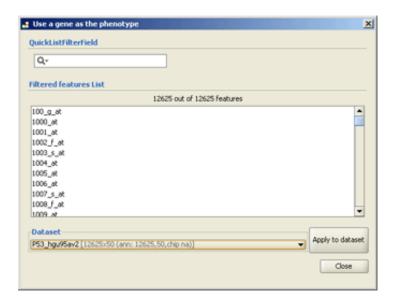
On the Run GSEA page, next to the *Phenotype labels* parameter, click the ellipse (...) button to display the following window, which allows you to a phenotype to analyze.



- Select source file. Select a phenotype labels file from the drop-down list. GSEA updates the window to display the
 phenotypes in the selected file. Select a phenotype to analyze and click OK.
- Show phenotypes from all source files. Updates the window to display all phenotypes from all loaded phenotype files (not phenotypes that you created using this window). Select a phenotype to analyze and click *OK*.
- Create an on-the-fly phenotype. Displays the following window, which allows you to create categorical phenotype labels:
 - Enter the names of one or more samples in the box on the left and enter a name for that phenotype class (by default, ClassA). For easier entering of sample names, cut and paste from your dataset file.
 - Enter the names of one or more samples in the box on the right and enter a name for that phenotype class (by default, ClassB). If your dataset contains samples not included in the two phenotypes, GSEA automatically excludes them from the gene set enrichment analysis of these phenotypes.
 - 3. Select your dataset and click *Apply to dataset*. GSEA confirms that all of the samples that you specified are in the selected dataset and creates a phenotype labels file (ClassAvsClassB.cls) in the default output folder. When you close this window, the new phenotype labels file appears in the *Select source file* drop-down list of the Select a Phenotype window.

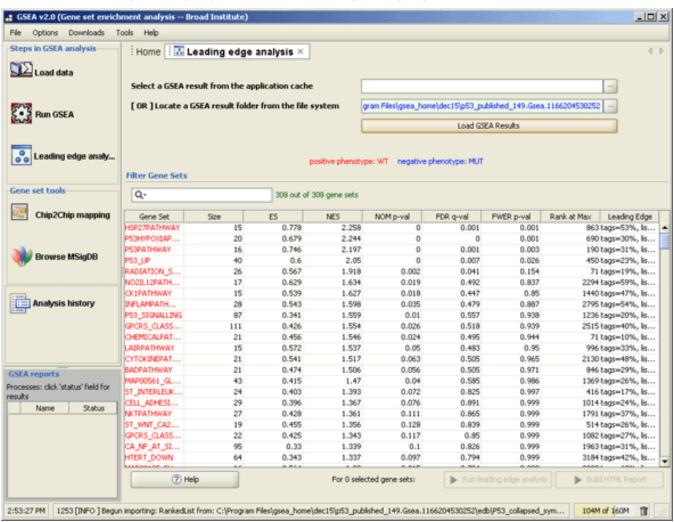


• Use a gene as the phenotype. Displays the following window, which allows you to create a continuous phenotype label to find gene set correlations with a gene of interest (gene neighbors). Select your dataset. GSEA updates the window to display the genes in the dataset. Select a gene and click *Apply to dataset*. GSEA confirms that the gene is in the selected dataset and creates a phenotype labels file (*genename_in_datasetname.cls*) in the default output folder. When you close this window, the new phenotype labels file appears in the *Select source file* drop-down list of the Select a Phenotype window.



Leading Edge Analysis Page

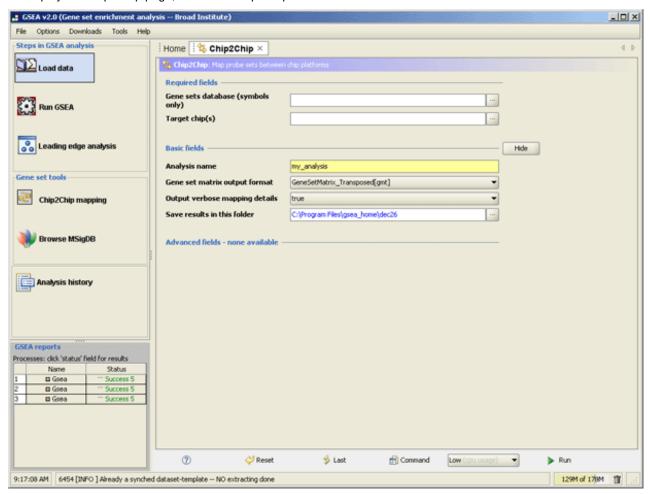
To display the Leading Edge Analysis page, select the Leading Edge Analysis icon in the GSEA main window. For more information, see Running a Leading Edge Analysis and Interpreting Leading Edge Analysis Results.



Chip2Chip Page

The Chip2Chip analysis translates the gene identifiers in a gene sets from HUGO gene symbols to the probe identifiers for a selected DNA chip. If you prefer to analyze your dataset without collapsing the probe sets to gene symbols, you can use Chip2Chip to translate MSigDB gene sets to the required chip platform format (see Consistent Feature Identifiers Across Data Files).

To display the Chip2Chip page, select the Chip2Chip icon in the GSEA main window.



Place your cursor on a parameter name to see a brief description of the parameter.

Required Fields lists parameters that are essential for the analysis. Enter values for these parameters before starting the analysis.

- Gene sets database. Click the ellipse (...) button and select one or more gene sets; genes in the selected gene sets must be identified by HUGO gene symbol:
 - GeneMatrix (from website) lists the MSigDB gene sets available on the Broad ftp site. These gene set files may
 contain hundreds of gene sets. Use the Browse MSigDB Page to browse the gene sets and to create gene set files
 (gmx/gmt) containing only gene sets of interest.
 - GeneSets(grp) lists gene sets that GSEA has created in memory; for example, gene sets created using the Text Entry tab described below.
 - GeneMatrix (gmx/gmt) lists the gene set files that you have loaded.
 - Subsets lists each gene set in each gmx/gmt file that you have loaded.
 - Text Entry allows you to create a gene set by entering the genes for that gene set; enter one gene per line. The gene
 set is created in memory and deleted when you exit from GSEA.
- Target chip(s). Click the ellipse (...) button and select one or more DNA chip (array) annotation files:
 - Chips (from website) lists the chip annotation files available on the Broad ftp site.
 - Chips (local .chip) lists the chip annotation files that you have loaded (see Loading Data).

Basic Fields lists additional parameters with standard defaults. Typically, you use the default values for these parameters. Click *Show/Hide* to display and hide these parameters.

- Analysis name. A short descriptive label for the analysis. The name cannot include spaces. This label is used as a prefix
 when naming the output report generated by the analysis (for example, my_analysis.Chip2Chip.1130510139575.rpt).
- Gene set database output format. Select a gene set file format for the new gene sets:
 - GeneSetMatrix_transposed [gmt] (default)
 - GeneSetMatrix [gmx]
- Output verbose mapping details. Set to True (default) to create a detailed report that lists the translation of each feature identifier in each gene set.
- Save results in this folder. Path of the directory in which to place the analysis results. Existing results in this folder are not
 overwritten. By default, analysis results are saved in the GSEA output folder. To view this folder, select Help>Show GSEA
 output folder.

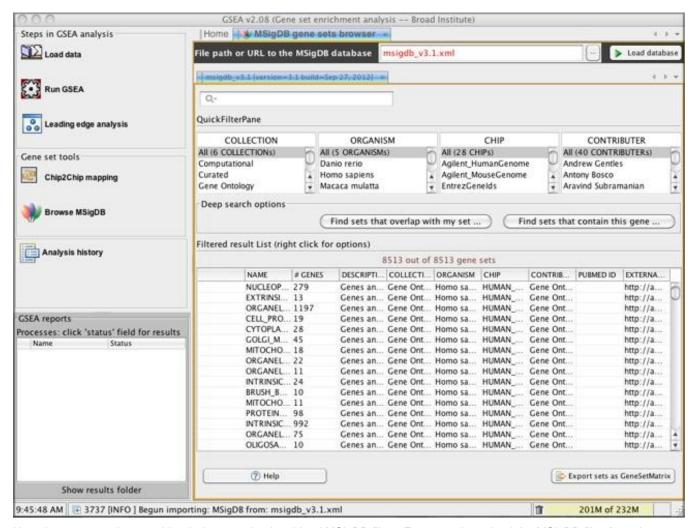
Buttons at the bottom of the page:

- Help. Displays this documentation.
- Reset. Restores the default values for all parameters.
- Last. Loads the data used the last time you ran this analysis.
- Command. Displays the command line used to run the analysis, as described in Running GSEA from the Command Line.
- Low/Normal (cpu usage). Determines the amount of CPU dedicated to this analysis. To use your computer for other tasks while running GSEA in the background, choose Low. To complete your analysis more quickly, choose Normal.
- Run. Starts the analysis.

Browse MSigDB Page

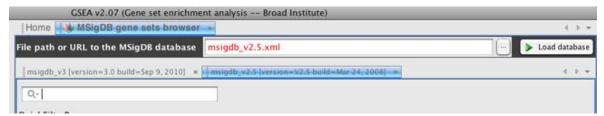
Use the Browse MSigDB page to explore the gene sets and to export the gene sets of interest to gene set files that can be used with the gene set enrichment analysis. To display the Browse MSigDB page, click the Browse MSigDB icon in the GSEA main window.

To display the latest gene sets on the Browse MSigDB page, click the Load database button.



Note that you can also use this window to upload archived MSigDB files. For example, to load the MSigDB files from the v2.5 release, enter "msigdb_v2.5.xml" in the *File path or URL to the MSigDB database* field and click the *Load database* button. Available archives include:

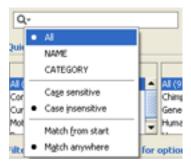
- msigdb_v3.xml
- msigdb_v2.5.xml
- msigdb_v2.1.xml



You can upload multiple versions of MSigDB, as shown in the figure, and toggle between them by clicking their respective tabs.

Use the filter field and the QuickFilterPane to filter the gene sets displayed in the table. GSEA displays gene sets that meet both the filter field AND quick filter criteria that you specify:

• The filter field is a text filter. As you enter text in the field, GSEA updates the list of gene sets to show only those that match that text. To change the text search options, click on the magnifying glass, as shown below:



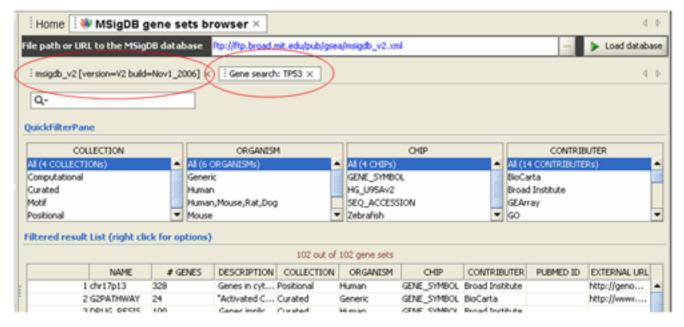
The filter shown above uses the default options All, Case insensitive, and Match anywhere to display all gene sets that have the characters "ca" anywhere in any column. To display gene sets whose names begin with the characters "ca", click the NAME and Match from start options.

• The QuickFilterPane filters gene sets based on the values in four key columns. When you select a value for a column in the QuickFilterPane, GSEA updates the list of gene sets to show only those that have the selected value in that column. For example, to display only Human gene sets, select Human from the Organism column in the QuickFilterPane.

The Deep Search Options provide more advanced search options:

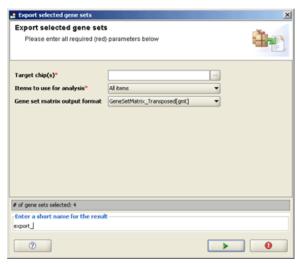
- Find Sets that overlap with my set prompts you for a gene set and a name for the search results. All genes in the gene
 sets should be specified as HUGO gene symbols. You can select a gene set that you already created in memory or enter
 the genes for a gene set:
 - GeneSets(grp) lists gene sets that have created in memory; for example, gene sets created using the Text Entry tab
 described below.
 - Text Entry allows you to create a gene set by entering the genes for that gene set; enter one gene per line. The gene
 set is created in memory and deleted when you exit from GSEA.
- Find sets that contain this gene prompts you for a gene (case insensitive HUGO gene symbol) and a name for the search results. GSEA finds all gene sets that contain the specified gene. For example, you might search for VAMP2.

When you select a Deep Search Option, GSEA performs the search and displays the results in a new tab identified by the name you supplied. The original MSigDB page remains displayed in a separate tab, as shown below:



To export gene sets from the MSigDB to a gene set file that can be used with GSEA:

- Select one or more of the gene sets in the table on the MSigDB page. To select multiple gene sets, use SHIFT-Click or CTRL-click.
- 2. Click Export sets as GeneSetMatrix. GSEA displays the following window:



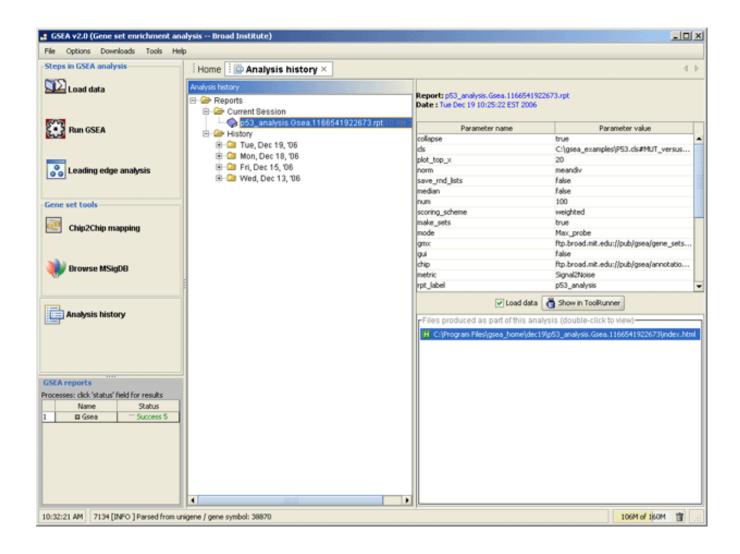
- 3. Select the target chip. Click the ellipse (...) button and select one or more DNA chip (array) annotation files:
 - Chips (from website) lists the chip annotation files available on the Broad ftp site.
 - Chips (local .chip) lists the chip annotation files that you have loaded (see Loading Data).

GSEA uses Chip2Chip to translate the gene identifiers in the gene sets from HUGO gene symbols to the probe identifiers for the selected DNA chips.

- 4. Select the items to export:
 - All items: exports all gene sets displayed in the table on the MSigDB page.
 - Selected items: exports only the selected gene sets in the table on the MSigDB page.
- 5. Select the file format for the gene set file. Typically, you want to select gmt.
- 6. Enter a name for the resulting gene set file.
- 7. Click OK. GSEA writes the gene sets file to the default output folder (Help>Show GSEA output folder).

Analysis History Page

To display the Analysis History page, select the Analysis History icon in the GSEA main window. The tree on the left lists all analyses in the GSEA output folder; those from the current session and those from previous sessions. When you select an analysis from the Analysis History tree, the analysis parameters and a list of files generated by the analysis appear on the right. For more information about using the Analysis History page, see Viewing Analysis Results.



GSEAPreranked Page

The GSEAPreranked page runs the gene set enrichment analysis against a ranked list of genes, which you supply.

Best Practices for Creating and Running Your Ranked List

The GSEAPreranked tool can be very helpful for performing gene set enrichment analysis on data that do not conform to the typical GSEA scenario. For example, it can be used when the ranking metric choices provided by GSEA are not appropriate for the data, or when a ranked list of genomic features deviates from traditional microarray expression data (e.g., GWAS results, ChIP seq, etc.). However, there are several important points that you should keep in mind when creating your input ranked list and running the GSEAPreranked tool.

Understand and keep in mind the sorting of your ranked list.

GSEAPreranked always sorts your data, without consideration of the data type. The numbers are treated the same whether they represent ranking metrics, significance *p* values, or something else. The list is sorted in descending numerical order, and there is no option to change this in the GSEAPreranked tool (unlike standard GSEA).

Avoid using GSEA to collapse your ranked list to gene symbols.

In order to calculate enrichment scores, GSEA needs to match genes from gene sets to those in your input ranked list. Typically, GSEA is run using gene sets from MSigDB, which consist of human gene symbols. If the input data contain other types of identifiers, such as Affymetrix probe set identifiers, they need to be converted to gene symbols to match the identifiers in MSigDB sets. GSEA provides the 'Collapse dataset to gene symbols' option to perform this conversion, which includes handling the case of several feature identifiers mapping to the same gene identifier. However, this option was developed and tuned with gene expression data in mind, whereas the numbers in a user-defined ranked list represent a metric that was computed by an unspecified ranking procedure outside of GSEA. Therefore, when using the GSEAPreranked tool, we recommend you provide a ranked list that already has unique human gene symbols and select 'false' for the parameter Collapse data set to gene symbols. Alternatively, you can use GSEA's collapse method to convert your features to human gene symbols as long as there are no duplicate features in the list and they have a one-to-one correspondence to human gene symbols.

Choose the right ranking metric.

It is important to make sure that the data do not include duplicate ranking values because GSEA does not resolve ties. In the case of a tie, the order of genes will be arbitrary, which may or may not produce erroneous results.

Understand and keep in mind the permutation test type.

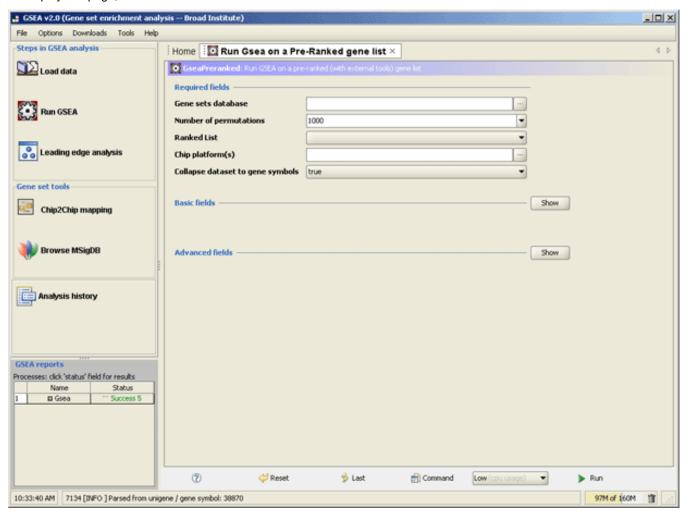
In GSEAPreranked, permutations are always done by gene set. In standard GSEA you can choose to set the parameter *Permutation type* to *'phenotype'* (the default) or *'gene set'*, but this option is not available in GSEAPreranked.

Understand and keep in mind how GSEA computes enrichment scores.

The GSEA PNAS 2005 paper introduced a method where a running sum statistic is incremented by the absolute value of the ranking metric when a gene belongs to the set. This method has proven to be efficient and facilitates intuitive interpretation of ranking metrics that reflect correlation of gene expression with phenotype. In the case of GSEAPreranked, you should make sure that this weighted scoring scheme applies to your choice of ranking statistic. When in doubt, we recommend using a more conservative scoring approach by setting *Enrichment statistic* = 'classic'. Please refer to the GSEA PNAS 2005 paper for further details.

Using GSEAPreranked

To display this page, select Tools>GseaPreranked.



Place your cursor on a parameter name to see a brief description of the parameter.

Required Fields lists parameters that are essential for the analysis. Enter values for these parameters before starting the analysis.

- Gene sets database. Click the ellipse (...) button and select one or more gene sets:
 - GeneMatrix (from website) lists the MSigDB gene sets available on the Broad ftp site. These gene set files may
 contain hundreds of gene sets. Use the Browse MSigDB Page to browse the gene sets and to create gene set files
 (gmx/gmt) containing only gene sets of interest.
 - GeneSets(grp) lists gene sets that GSEA has created in memory; for example, gene sets created using the Text Entry tab described below.
 - GeneMatrix (local gmx/gmt) lists the gene set files that you have loaded (see Loading Data).
 - Subsets lists each gene set in each gmx/gmt file that you have loaded.
 - Text Entry allows you to create a gene set by entering the genes for that gene set; enter one gene per line. The gene
 set is created in memory and deleted when you exit from GSEA.
- Number of permutations. Specify the number of gene_set permutations to perform in assessing the statistical significance
 of the enrichment score. It is best to start with a small number, such as 10. After the analysis completes successfully, run
 it again with a full set of permutations. The GSEA recommends 1000 gene_set permutations.
- Ranked list. Select a ranked list file (rnk) that you have loaded into GSEA.

If necessary, create a ranked gene list file (rnk) that defines the list of ranked genes. For a description of this file format, see GSEA file formats. You can create and edit the file using any text editor. If you use Excel, be sure to save the file as a tab-limited text file. Load the file into GSEA, as described in Loading Data.

- Chip platform(s). Click the ellipse (...) button and select one or more DNA chip (array) annotation files:
 - Chips (from website) lists the chip annotation files available on the Broad ftp site.
 - Chips (local .chip) lists the chip annotation files that you have loaded (see Loading Data).

This parameter is mandatory or optional depending on the value of the Collapse dataset to gene symbols parameter.

- Collapse dataset to gene symbols:
 - Select True (default) to have GSEA collapse each probe set in the ranked list into a single vector for the gene, which
 gets identified by its HUGO gene symbol. When you select True, you must specify a chip annotation file (*Chip*platform parameter) and gene sets (*Gene sets database* parameter) that identify genes by HUGO gene symbol.
 - Select False to use your ranked list as is (with its native feature identifiers). When you select this option, the chip annotation file (*Chip platform* parameter) is optional and you must specify gene sets (*Gene sets database* parameter) that identify genes using the same feature (gene or probe) identifiers as those used in your ranked list.

For more information, see Consistent Feature Identifiers Across Data Files.

Basic Fields lists additional parameters with standard defaults. Typically, you use the default values for these parameters. Click *Show/Hide* to display and hide these parameters.

- Analysis name. A short descriptive label for the analysis. The name cannot include spaces. This label is used as a prefix
 when naming the output report generated by the analysis (for example,
 my_analysis.CollapseDataset.1130510139575.rpt).
- Enrichment statistic. To calculate the enrichment score, GSEA first walks down the ranked list of genes increasing a running-sum statistic when a gene is in the gene set and decreasing it when it is not. The enrichment score is the maximum deviation from zero encountered during that walk. This parameter affects the running-sum statistic used for the analysis. The last section of the Gene Set Enrichment Analysis PNAS paper shows the mathematical descriptions of the methods used in GSEA. This option controls the value of p used in the enrichment score calculation shown there:
 - classic: p=0
 - weighted: (default). p=1
 - weighted_p2: p=2
 - weighted_p1.5: p=1.5
- Max size. After filtering from the gene sets any gene not in the expression dataset, gene sets larger than this are excluded from the analysis.
- Min size. After filtering from the gene sets any gene not in the expression dataset, gene sets smaller than this are
 excluded from the analysis.
- Save results in this folder. Path of the directory in which to place the analysis results. Existing results in this folder are not
 overwritten. By default, analysis results are saved in the GSEA output folder. To view this folder, select Help>Show GSEA
 output folder.

Advanced Fields lists parameters that control details of the GSEA algorithm and its Java implementation. Do not change the default values of these parameters unless you are conversant with the algorithm and its Java implementation. Click *Show/Hide* to display and hide these parameters.

- Collapsing mode for probe sets => 1 gene. Used only when the *Collapse dataset to gene symbols* parameter is set to True. Select the expression values to use for the single probe that will represent all probe sets for the gene:
 - max probe (default): for each sample, use the maximum expression value for the probe set. For example:

Probeset_A	10	20	15	200
Probeset_B	100	105	110	95
gene_symbol_AB	100	105	110	200

- median_of_probes: for each sample, use the median expression value for the probe set.
- Normalization mode. Method used to normalize the enrichment scores across analyzed gene sets:
 - meandiv (default): GSEA normalizes the enrichment scores as described in Normalized Enrichment Score (NES).
 - none: GSEA does not normalize the enrichment scores.
- Omit features with no symbol match. Used only when Collapse dataset to gene symbols is set to True. By default (true),
 the new dataset excludes probes/genes that have no gene symbols. Set to False to have the new dataset contain all
 probes/genes that were in the original dataset.

- Make detailed gene set report. Set to True (default) to create a detailed gene set report for each enriched gene set.
- Plot graphs for the top sets of each phenotype. Generates summary plots and detailed analysis results for the top x genes in each phenotype, where x is 20, by default. The top genes are those with the largest normalized enrichment scores.
- Seed for permutation. Seed used to generate a random number for phenotype and gene_set permutations: timestamp (default) or 149. The specific seed value (149) generates consistent results, which is useful when testing software.
- Make a zipped file with all reports. Set to True (default=false) to create a zip file of the analysis results. The zip file is saved to the GSEA output folder with all of the other files generated by the analysis.

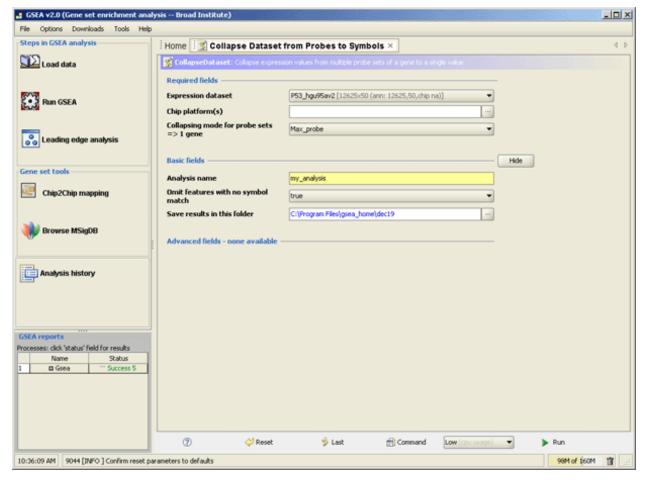
Buttons at the bottom of the page:

- · Help. Displays this documentation.
- Reset. Restores the default values for all parameters.
- Last. Loads the data used the last time you ran this analysis.
- Command. Displays the command line used to run the analysis, as described in Running GSEA from the Command Line.
- Low/Normal (cpu usage). Determines the amount of CPU dedicated to this analysis. To use your computer for other tasks
 while running GSEA in the background, choose Low. To complete your analysis more quickly, choose Normal.
- Run. Starts the analysis.

CollapseDataset Page

CollapseDataset creates a new dataset by collapsing all probe set values for a gene into a single vector of values. The new dataset uses gene symbols as the gene identifier format. When you use the new dataset in a gene set enrichment analysis, be sure that your gene sets and array annotations also use gene symbols as the gene identifier format. For more information, see Consistent Feature Identifiers Across Data Files.

Note: By default, when you use the Run GSEA icon to run the gene set enrichment analysis, GSEA uses the CollapseDataset tool to collapse the dataset before running the gene set enrichment analysis. For more information, see the *Collapse dataset to gene symbols* parameter on the Run GSEA Page.



Place your cursor on a parameter name to see a brief description of the parameter.

Required Fields lists parameters that are essential for the analysis. Enter values for these parameters before starting the analysis.

- Expression dataset. Select your expression dataset from the drop-down list. If the dataset is not listed, you have not yet loaded it; see Loading Data.
- Chip platform(s). Click the ellipse (...) button and select one or more DNA chip (array) annotation files:
 - Chips (from website) lists the chip annotation files available on the Broad ftp site.
 - Chips (local .chip) lists the chip annotation files that you have loaded (see Loading Data).
- Collapsing mode for probe sets => 1 gene. Select the value to use for the single probe that will represent all probe sets for the gene:
 - max_probe (default): for each sample, use the maximum expression value for the probe set. For example:

Probeset_A	10	20	15	200
Probeset_B	100	105	110	95
gene_symbol_AB	100	105	110	200

median of probes: for each sample, use the median expression value for the probe set.

Basic Fields lists additional parameters with standard defaults. Typically, you use the default values for these parameters. Click *Show/Hide* to display and hide these parameters.

- Analysis name. A short descriptive label for the analysis. The name cannot include spaces. This label is used as a prefix
 when naming the output report generated by the analysis (for example,
 my_analysis.CollapseDataset.1130510139575.rpt).
- Omit features with no symbol match. By default (true), the new dataset excludes features (genes) that have no gene symbols. Set to False to have the new dataset contain all features (genes) that were in the original dataset.
- Save results in this folder. Path of the directory in which to place the analysis results. Existing results in this folder are not
 overwritten. By default, analysis results are saved in the GSEA output folder. To view this folder, select Help>Show GSEA
 output folder.

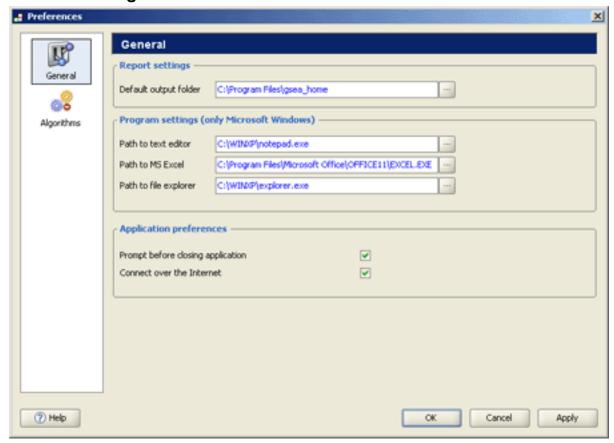
Buttons at the bottom of the page:

- Help. Displays this documentation.
- Reset. Restores the default values for all parameters.
- Last. Loads the data used the last time you ran this analysis.
- Command. Displays the command line used to run the analysis, as described in Running GSEA from the Command Line.
- Low/Normal (cpu usage). Determines the amount of CPU dedicated to this analysis. To use your computer for other tasks while running GSEA in the background, choose Low. To complete your analysis more quickly, choose Normal.
- Run. Starts the analysis.

Preferences Window

To display the Preferences window, select Options>Preferences. Use this window to set GSEA configuration options.

General Settings

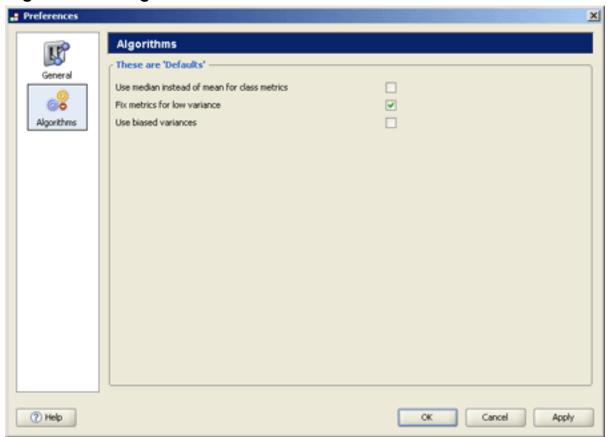


- Report settings:
 - Default output folder. When you run an analysis, by default, the results are written to this folder. To view this folder from GSEA, select Help>Show GSEA output folder.

Note: If you choose a new folder, previously run reports remain in the old folder, unless you choose to move them.

- Program settings (used only when GSEA is running under Windows). Select the full path of the executable for each tool.
 To open these tools in GSEA, on the Load Data page, select a file in the Recently Used Files or Object Cache pane and right-click in that area to display a tools menu. Select the tool from the menu.
- Application preferences:
 - Prompt before closing application. When selected, if you close the GSEA application by clicking the X icon in the upper right corner, GSEA prompts you to confirm that you want to exit the application. This setting is also on the Options menu; you can change it here or there.
 - Connect over the internet. When selected, the *Gene sets database* and *Chip platform(s)* parameters (on pages such as the Run GSEA page) displays data files available on the Broad ftp site. If you are working offline, clear this option to disable this feature and avoid a time-consuming attempt to connect to the internet. This setting is also on the Options menu; you can change it here or there.

Algorithm Settings



These settings are also on the Options menu; you can change them here or there.

Documentation Update History

Version	Release date	Comments
2.0.7	September 2010	Updated the Browse MSigDB page.
2.0.2	February 2009	Updated Running GSEA from the Command Line as follows: Files cannot be directly accessed from the GSEA ftp site. Download the desired gene set or array annotations files from the GSEA web site (http://www.broadinstitute.org/gsea/downloads.jsp) and reference the downloaded files in the command line.
2.0.1	April 2008	Updated references to gene set pages.
2.0.1	December 2007	Updated graphic in Starting GSEA. Removed –Dhome parameter in Running GSEA from the Command Line. Minor updates to the Leading Edge Analysis report: Heat Map and Set-to-Set.
2.0.1	10 July 2007	Added cDNA Microarray Data.
2.0.1	23 January 2007	Changed number of recommended gene_set permutations from 10000 to 1000.
2.0	16 January 2007	GSEA 2.0 Release