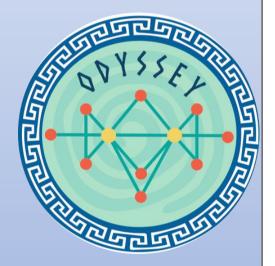
Availability and implementation: The Odyssey software is freely available for non-profit academic use at https://diagnose.shinyapps.io/odyssey/. The source code, example datasets are available at https://github.com/alptaciroglu/Odyssey. Contact: taciroglu.alperen@metu.edu.tr



ODYSSEY

A TOOL FOR MICRORNA-MRNA EXPRESSION ANDINTERACTION VISUALIZATION



Bilkent University KONU Lab METU Informatics ACAR Lab



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Summary

"Odyssey" has been built for interactive visualization the interaction networks of miRNAs with along with their target expressions for a dataset either user uploaded or found in the Odyssey as default datasets (please see the list below) (Figure 1). It is built using Shiny package of the R programming language leading to seamless online access and modularity. The aim is to provide users a user-friendly web-application which consists of modules that allows:

- Uploading of their own data or reanalyzing existing public mRNA/microRNA datasets;
- Performing differential expression (DGEx) analysis;
- Visualization of the network of "Odyssey" builds from either experimentally validated or predicted interactions;
- Run a prioritization algorithm for positive or negative associations between miRNA/mRNA pairs by the node ID or the node degree, to selectively highlight nodes and uncover emergent biological signatures.
- Draw scatterplot and analyze association between Correlation Score% ~ logFC quantitative variables for each miRNA / mRNA node in network

Interaction information between microRNAs and genes can be derived from experimentally validated interactions using miRNet [1] or predictions on TargetScan [2] or both.

Odyssey enables the user to filter selected nodes to create refined networks through;

- Using fold change cut-offs obtained in DGEx;
- Using degree value of the nodes;
- Highlighting negative-associated miRNA- mRNA pairs by phasing out positively associated pairs or vice versa.

Furthermore, the application has been demonstrated using two different public miRNA-mRNA expression datasets in the Example Case section of Tutorials. Odyssey has integrated 13 different public miRNA-mRNA expression datasets while it also allows for using user uploaded miRNA and/or mRNA datasets given the expression data platform is one of the below-mentioned ones.

Odyssey is available at https://diagnose.shinyapps.io/odyssey/

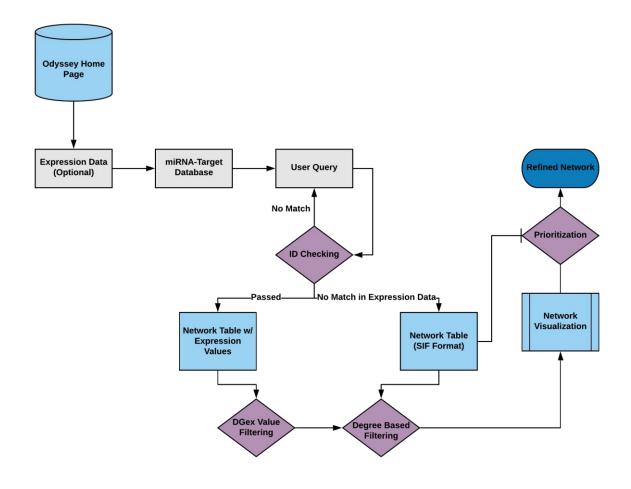


Figure 1. Flowchart of Odyssey v1.0.

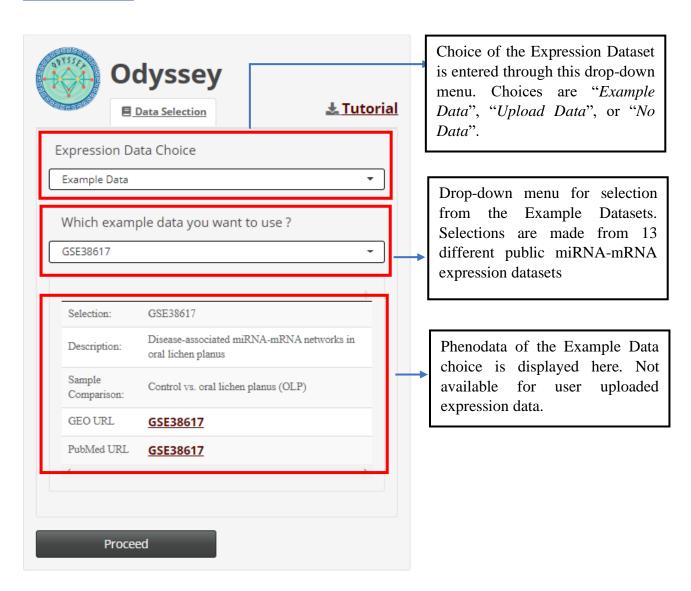
Table 1: List of expression platforms supported in the current version:

mRNA expression data platforms	miRNA expression data platforms
GPL570 [HG-U133_Plus_2]	GPL8786 [miRNA-1]
GPL96 [HG-U133A]	GPL14613 [miRNA-2]
GPL97 [HG-U133B]	GPL16384 [miRNA-3]
GPL6244 [HuGene-1_0-st]	GPL21572 [miRNA-4]
GPL17692 [HuGene-2_1-st]	

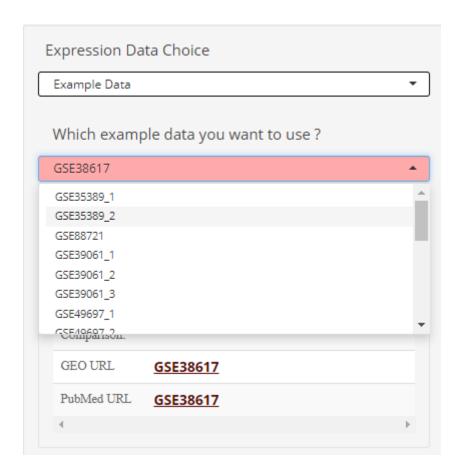
Table 2: List of default expression datasets:

Dataset ID GEO	GEO URL	PubMed URL	Control Samples	Treatment Samples
GSE25402	GSE25402	PMID:22688341	Non-obese	Obese
GSE32539_1	GSE32539	PMID:23783374	Control	Idiopathic pulmonary fibrosis (IPF) / Usual interstitial pneumonia
GSE32539_2	GSE32539	PMID:23783374	Control	Nonspecific Interstitial Pneumonia
GSE32539_3	GSE32539	PMID:23783374	Control	Respiratory bronchiolitis- interstitial lung disease
GSE34681_1	GSE34681	PMID:22244333	Control	Ars2 siRNA-1
GSE34681_2	GSE34681	PMID:22244333	Control	DGCR8 siRNA-1
GSE38617	GSE38617	PMID:23723971	Control	oral lichen planus (OLP)
GSE39061_1	GSE39061	PMID:23590309	Confluent	Day 28 (differentiated)
GSE39061_2	GSE39061	PMID:23590309	Subconfluent	Confluent
GSE39061_3	GSE39061	PMID:23590309	Subconfluent	Day 28 (differentiated)
GSE40321	GSE40321	No PubMed URL	46 XY	47 XY, +8
GSE49697_1	<u>GSE49697</u>	PMID:25645730	US_48h (unstimulated) (poolBC removed)	S_48h (stimulated) (poolBC removed)
GSE49697_2	GSE49697	PMID:25645730	US_24h (unstimulated) (poolBC removed)	S_24h (stimulated) (poolBC removed)
GSE59702_1	<u>GSE59702</u>	PMID:25587024	Match normal of fusion negative tumor	Fusion negative tumor
GSE59702_2	<u>GSE59702</u>	PMID:25587024	Match normal of fusion positive tumor	Fusion positive tumor
GSE104268_1	GSE104268	No PubMed URL	Control	GSE
GSE104268_2	GSE104268	No PubMed URL	Control	TSA
GSE81867	GSE81867	No PubMed URL	Transwell Static	Chip
GSE90604	GSE90604	No PubMed URL	All Healthy Tissues	Glioblastoma
GSE35389_1	GSE35389	PMID:23056502	Normal melanocyte	Melanoma
GSE35389_2	GSE35389	PMID:23056502	Melanoma	Melanoma exosome
GSE88721	GSE88721	PMID:28327132	Meningial Cells	Meningioma

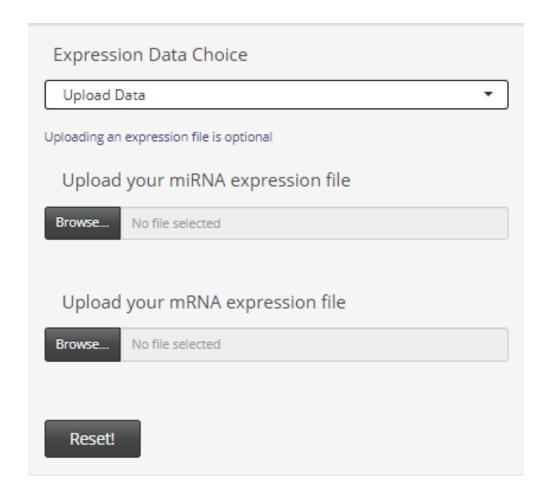
Home Page



Expression Data Choice



Odyssey currently utilizes 13 different public miRNA-mRNA expression datasets and phenodata of manually curated 22 total comparisons based on these datasets, which are indicated as GSExxx_1, GSExxx_2 etc. The comparisons are made by selecting different control and/or treatment samples to perform differential expression analysis with.



Selecting "Upload Data" from the "Expression Dataset Choice" drop-down menu creates two "fileInput" areas to upload the miRNA expression file and mRNA expression file respectively. Expected upload format is limited to "Series Matrix File(s)" in GEO database [3]. Odyssey checks whether the uploaded format is correct, and whether the uploaded expression data is log transformed by base 2. If the file is not log transformated, Odyssey will perform this automatically.

Users also have the option to upload either one of the expression files and leave the other "fileInput" area blank, e.g. miRNA data uploaded only with no mRNA data.

Data Upload

Users can upload their own expression data to analyze for any biological interest using Odyssey. There are two main limitations for the data upload; namely:

- Data format limitation
- Data platform limitation

Odyssey accepts expression data from platforms listed in the Home Page section of this tutorial document, in Series Matrix File(s) format downloaded and extracted from Gene Expression Omnibus database.

Download family			Format
SOFT formatted family file(s)	SOFT 2		
MINIML formatted family file(s	MINIML 2		
Series Matrix File(s)			TXT 2
Supplementary file	Size	Download	File type/resource
GSE32539_RAW.tar	831.2 Mb	(http)(custom)	TAR (of CEL)

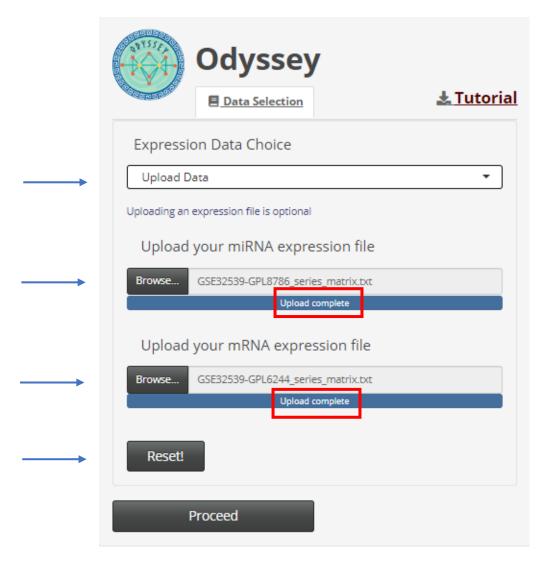
This screenshot is taken from https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE32539.

Users need to click on "Series Matrix File(s)" link to download the expression data.

Index of /geo/series/GSE32nnn/GSE32539/matrix/



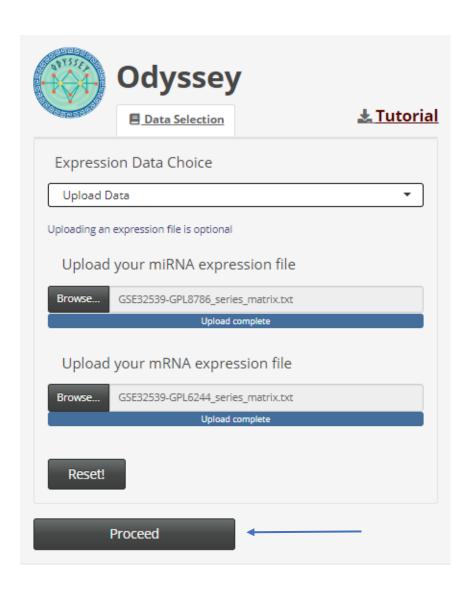
When clicked, a directed webpage will be loaded. For the example dataset of GSE32539, there are two different series matrix files. GPL6244 [HuGene-1_0-st] is a mRNA expression array and GPL8786 [miRNA-1] is a miRNA expression array. Clicking on any of the links will start downloading the corresponding expression data file in compressed format (.gz). Users may use any of the file archiver / compressor supported by their Operating System to extract the uncompressed file.

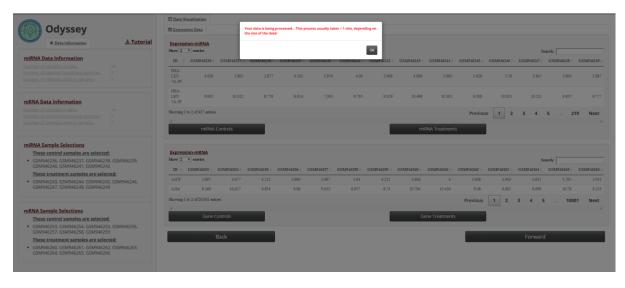


After successfully extracting the Series Matrix Files, the obtained files should be in ".txt" format. In order to analysis to commence, "Upload Data" should be selected from Expression Data Choice drop-down menu and files should be uploaded to their respective fileInput zones. "Upload complete" sign will mark the successfully uploaded data, however successfully uploaded data can still be in wrong format and may not be accepted to proceed with the analysis. If there is need to remove uploaded data, "Reset" button may be clicked to do so.

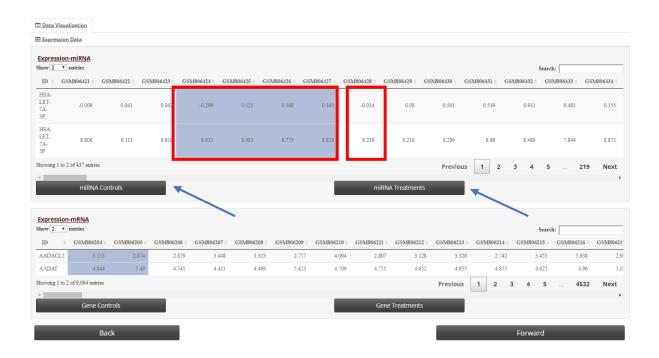
After data is uploaded, to continue with the analysis "*Proceed*" is clicked. If at least one of the miRNA or mRNA fileInput zones are uploaded with data, a modal window will appear indicating the commencing of the analysis.







If the uploaded data is in acceptable format, data will be displayed in the "Main Panel" as described in the Data Visualization section of the tutorial. However, uploading a data will prompt "Control" and "Treatment" sample selection for both miRNA and mRNA data. Using any integrated Example Data does not require Control and Treatment sample selection as these selections are already made for each dataset implemented.



Selection of the samples are handled by column-wise clicking on the samples on the data table. Odyssey allows multiple sample selections which means each clicked sample will be highlighted with blue color, shown in screenshot above. "miRNA Controls" and "miRNA Treatments" buttons mark the sample selections and the selected samples are displayed in an information box placed in the Side Panel.





Control and Treatment sample selection for mRNA data is displayed in the screenshot above. Clicking "Forward" button takes the analysis on to next step and clicking "Back" button at this step sends the application to Home Page.

Failing to select either Control or Treatment samples from either one of the miRNA or mRNA data prompts a modal window, preventing the analysis to go further without completing necessary selections.

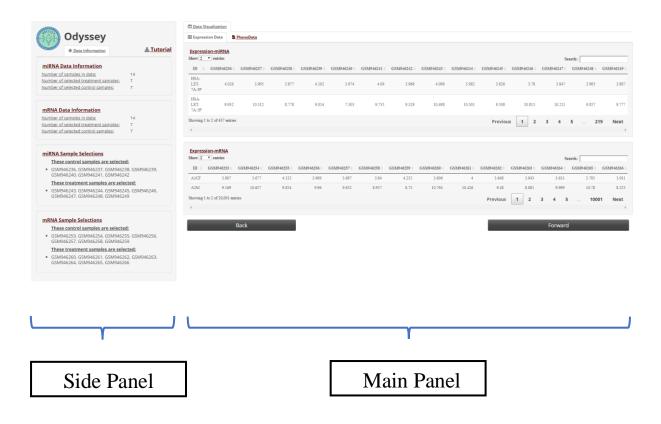


Data Visualization

! Skip to next section if "No Data" option used

Upon making sure miRNA/mRNA ID is found without any irrecoverable errors, Odyssey loads and displays the expression data on the "Data Visualization Tab" inside "Main Panel". Expression data are displayed in a nested manner using "Expression Data Tab". Phenodata associated with selected dataset is also displayed fully in "Phenodata Tab" as stored in GEO database.

Phenodata Tab is specific to the integrated Example Data Selections in Odyssey and will not be visible on "Data Upload" option.



"Back" and "Forward" buttons, which are displayed at the bottom of the main panel, need to be used to take the analysis one step backwards or one step forward, respectively.

Data Information



<u>
★ Tutorial</u>

miRNA Data Information

Number of samples in data: 14

Number of selected treatment samples: 7

Number of selected control samples: 7

mRNA Data Information

Number of samples in data: 14

Number of selected treatment samples: 7

Number of selected control samples: 7

Information boxes display the number of samples in miRNA & mRNA expression data and how many samples are selected as treatment and control samples for the proceeding differential gene expression analysis.

miRNA Sample Selections

These control samples are selected:

 GSM946236, GSM946237, GSM946238, GSM946239, GSM946240, GSM946241, GSM946242

These treatment samples are selected:

 GSM946243, GSM946244, GSM946245, GSM946246, GSM946247, GSM946248, GSM946249

mRNA Sample Selections

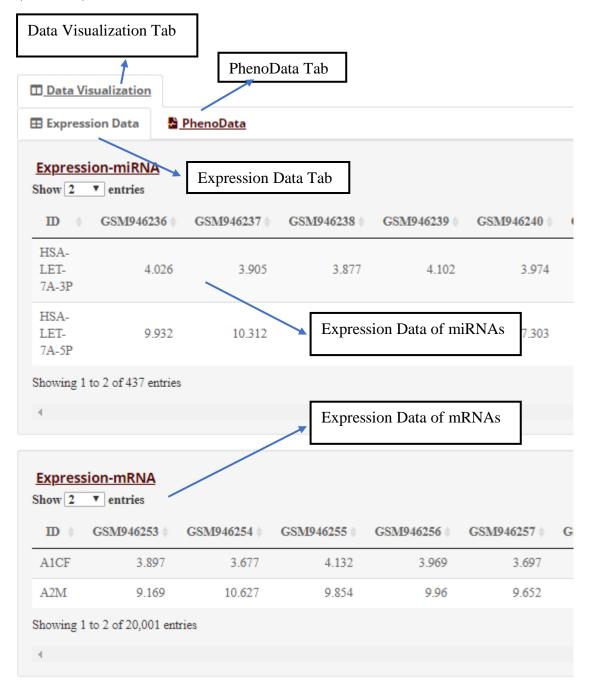
These control samples are selected:

 GSM946253, GSM946254, GSM946255, GSM946256, GSM946257, GSM946258, GSM946259

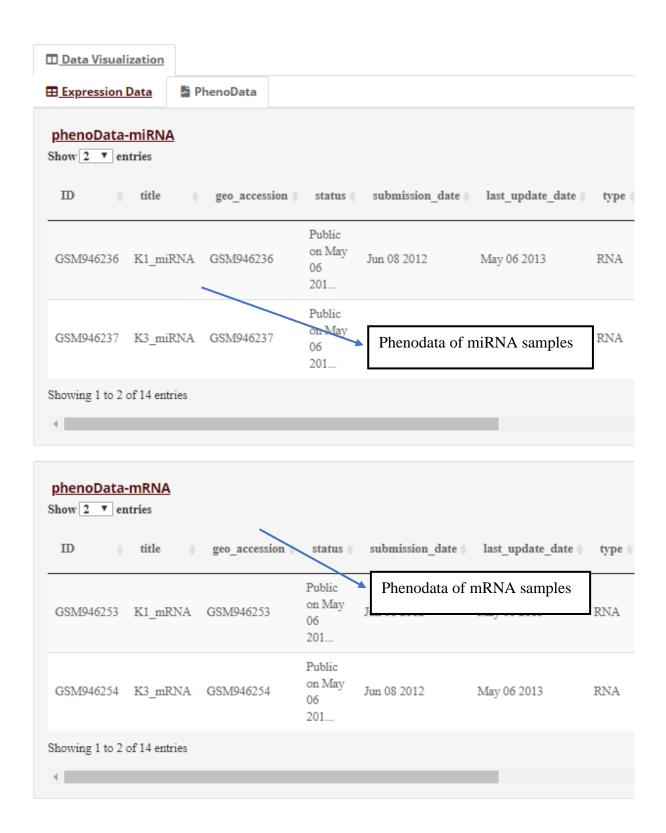
These treatment samples are selected:

 GSM946260, GSM946261, GSM946262, GSM946263, GSM946264, GSM946265, GSM946266 Information boxes displays the names of the samples in miRNA & mRNA expression data that are selected as treatment and control samples for the proceeding differential gene expression analysis.

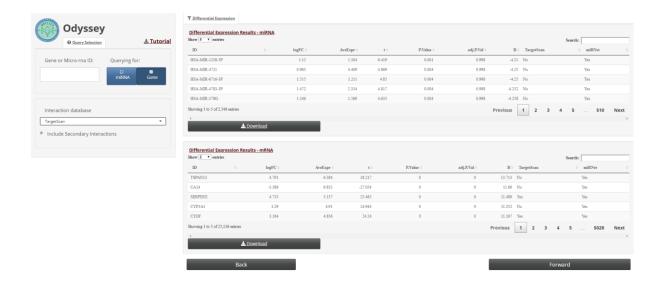
A close view of the *Data Visualization Tab* with *Expression Data Tab* selected (truncated) is as follows.



A close view of the *Data Visualization Tab* with *PhenoData Tab* selected (truncated) is as follows.

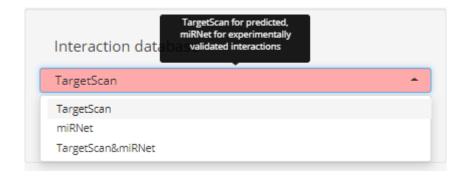


Query Selection



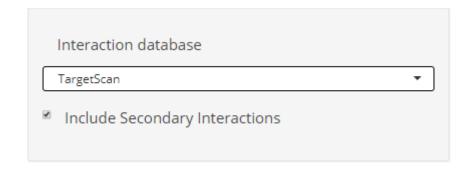
At this step, users are expected to input a gene / microRNA query. Also, differential expression gene analysis result on the previously selected expression data set (if selected) is displayed here.

Interaction database



Selection of "TargetScan&miRNet" will reveal another drop-down menu for selection of "Intersect" or "Union" of interaction databases. Consequently, union of these two interaction databases is likely to harbor more miRNA-mRNA interactions.

Include Secondary Interactions

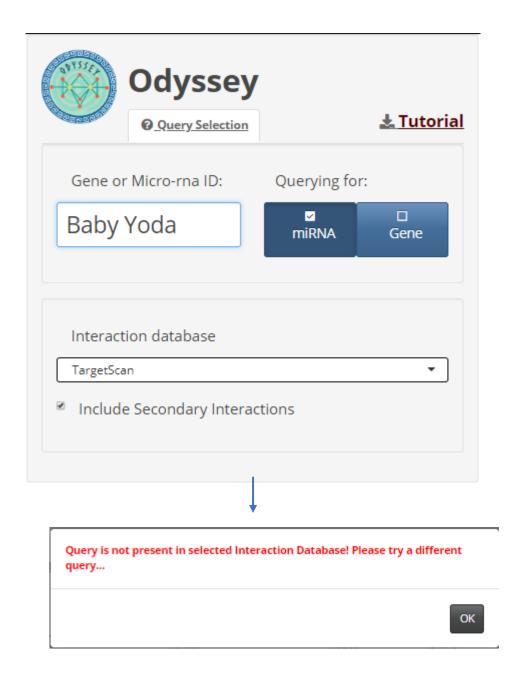


Selection of "Include Secondary Interactions" expands the initial network by including second degree interactions on first degree interactions of the query.

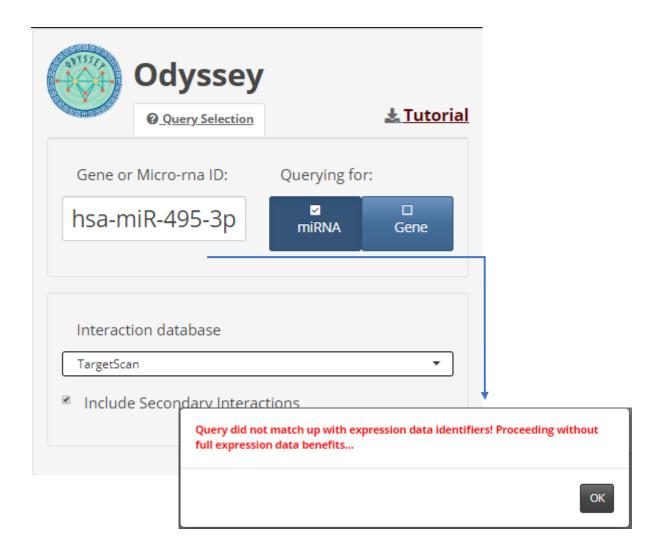
ID Checking

Odyssey requires an ID for an mRNA or microRNA entered in the query box where it says enter gene/miRNA ID. If a query does not result in a hit in the Odyssey session the error handling module tries to handle these situations, depending on type of generated error.

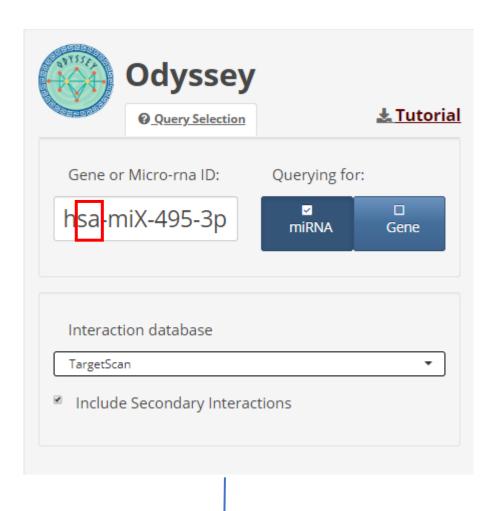
There may not be a hit found in the Odyssey database due to using different identifiers than the allowed "Official Gene Name", "miRBase v22" IDs. In other cases, no record of the query can be found in TargetScan and/or miRNet databases or in the platform of the expression dataset used. These types of queries generate an <u>irrecoverable error</u> and Odyssey directs user to select a different query.



A query may be in the right format in terms of the class of identifiers used and they also have records of interactions in TargetScan and/or miRNet databases, yet the selected expression dataset might not have all of the counterparts of these identifiers of which Odyssey needs to color the network. These types of queries generate a <u>recoverable error</u>; and Odyssey warns the user if proceeded not all data are available.



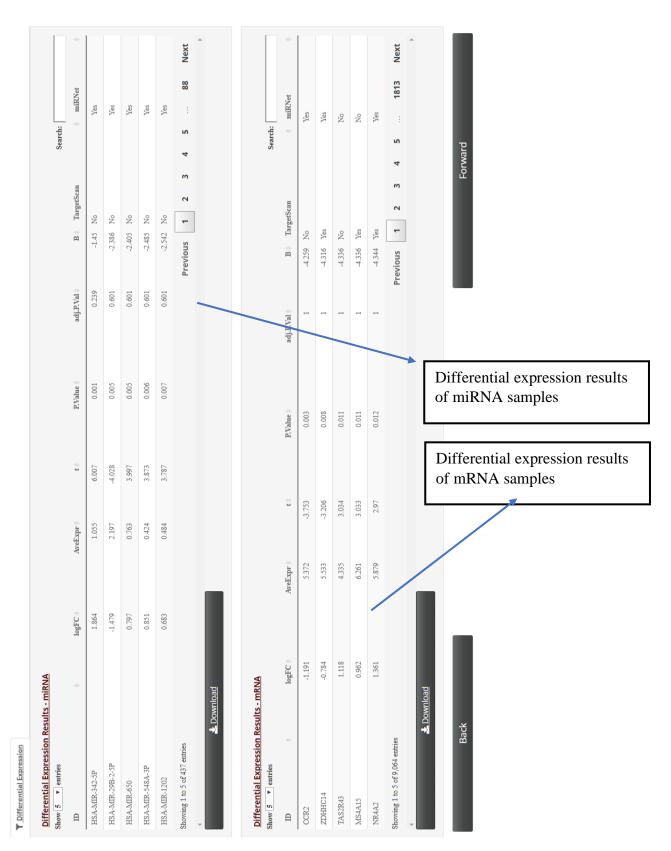
A query might have a typo(s) or does not include an exact match but a partial one. In this case, Odyssey reports an <u>irrecoverable error</u> and such cases are handled by a displayed report that contains the error cause and potential matches.



Query is not present in selected Interaction Database! Select from similar identifiers or try a different query. Here are a few similar matches ... HSA-MIR-490-3P HSA-MIR-485-3P

ОК

Differential Expression Analysis Visualization



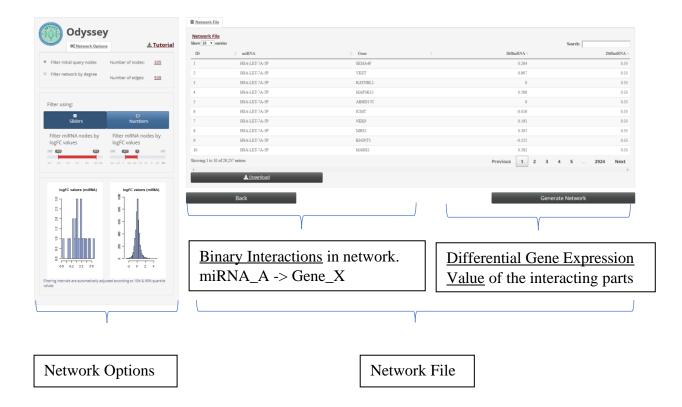
A close view of the Differential Expression Tab selected (truncated) is as follows.

In the Differential Expression tab, differential expression analysis (DGEx) results are displayed. The analysis is conducted with limma package [4] and ordered descending with regards to adj. p. value. Correspondingly, most significant results are displayed at the top. Besides DGEx, the presence or absence of miRNAs / mRNAs are added to the tables, aimed to conveniently run Odyssey with different biological molecules that are significant in the dataset of choice according to limma results.

Network Options and Network File

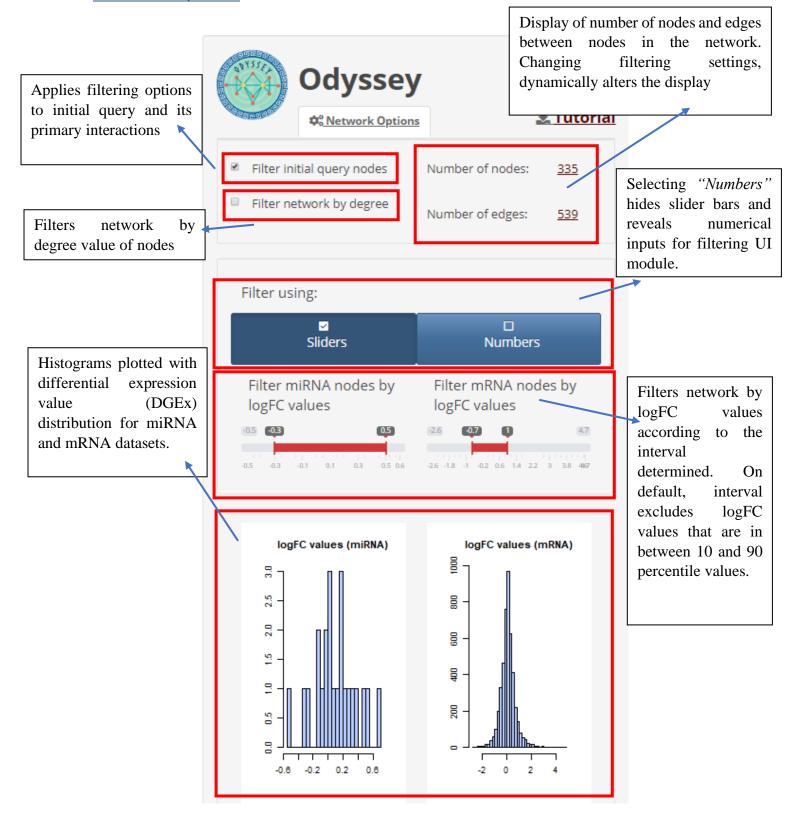
Clicking on *Forward* button after the data selection part is completed (even if "No Data" is selected) takes the analysis to next step. At this step, information about the network is displayed, user can decide the strictness of the filtering criteria to be applied on to the prospective network.

Size of the network, i.e. number of nodes in the network and number of edges between these nodes are dynamically displayed as the filtering parameters changed, allowing user to have control over the magnitude of the network prior to its creation.



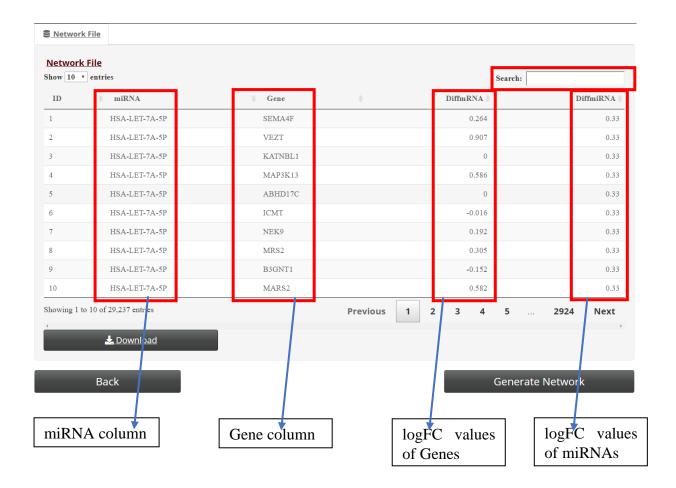
Above is the example run from Odyssey with query "*PMAIP1*" as gene, "TargetScan" as interaction database and "GSE104268_2". Filtering options are explained in detail on this example run in the next section.

Network Options



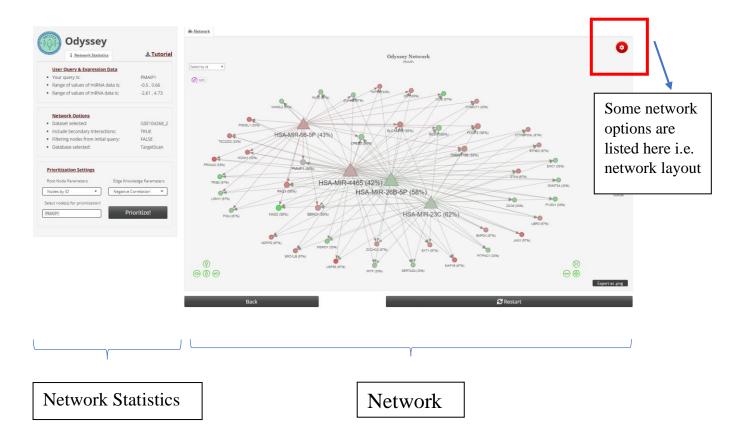
Ticking / unticking "Filter initial query nodes", "Filter network by degree" or changing either one of the intervals "Filter miRNA nodes by logFC values" or "Filter mRNA nodes by logFC values" dynamically changes number of nodes and edges between these nodes. These changes are displayed in Network Options.

Network File



Binary interactions are displayed row-wise with their respected differential expression values. Also, the search button placed on top of the data table conveniently allows searching individual miRNAs and /or Genes from a large network. After desired options for the network is determined, "Generate Network" button is clicked and the network is visualized in the next step.

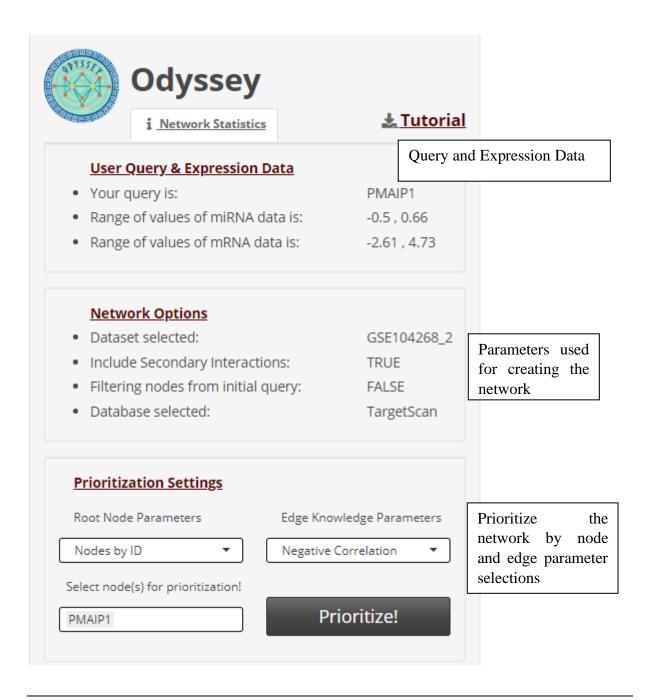
Network Statistics and Visualization



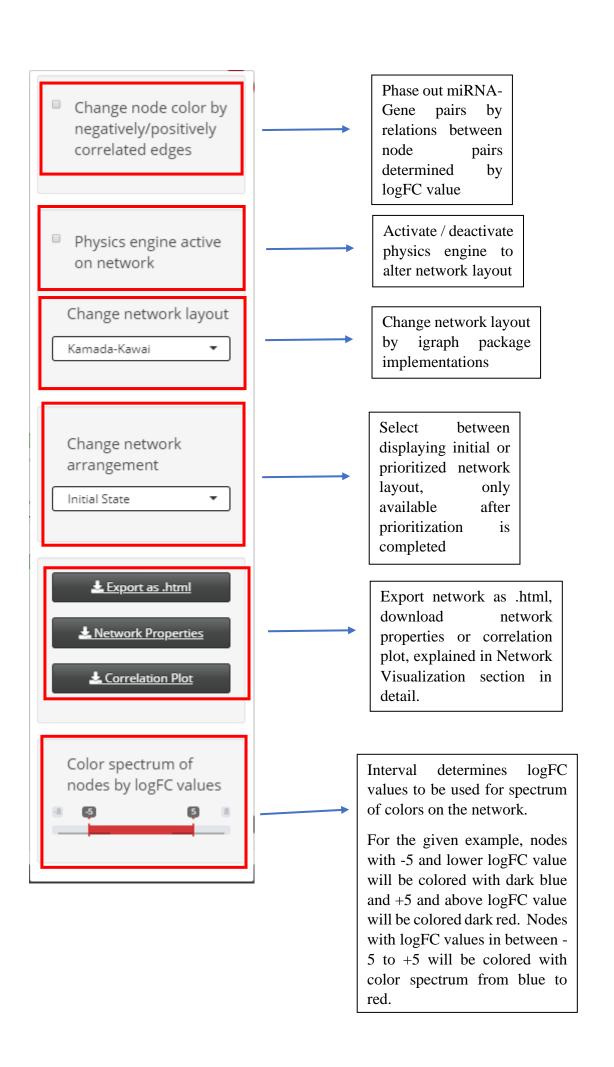
Pressing "Generate Network" button in the previous step makes Odyssey visualize the network as shown in the example above. Parameters that were used in the Network's creation is displayed in "Network Statistics" tab along with a few interactive settings that can be applied on to drawn network i.e. layout algorithm selection and prioritization (Explained in the Network Statistics section of Tutorial).

The network is visualized at the right section of the application, allowing interactive node selection and dragging and downloading the network in different formats (Explained in the Network Visualization section of Tutorial).

Network Statistics



Prioritization Settings contains the options to be used to employ the prioritization. Further details are given in the Prioritization section of this tutorial document.



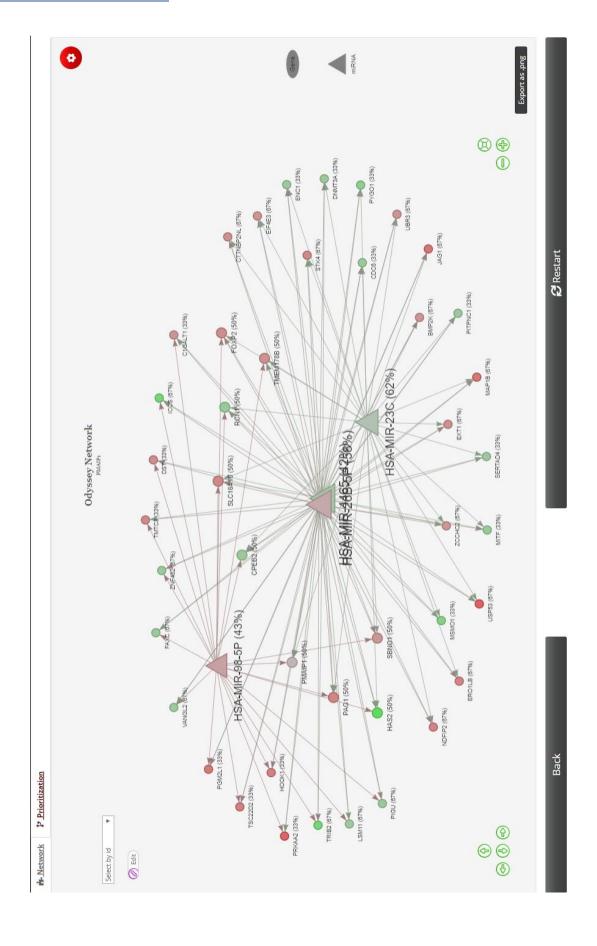
If expression data is used in the session, Odyssey draws networks based on miRNA / mRNA interactions with each node having a corresponding logFC value. logFC values can be positive (upregulation) or negative (downregulation) based on the comparison of Treatment vs Control samples listed in the expression dataset used. A percentage score of correlation is calculated for each node based direct interactions with other nodes shown in the network.

If a microRNA is listed as upregulated and shown to be interacting with 3 downregulated and 1 upregulated gene in the network, corresponding score of correlation for that particular microRNA is 75%. If another microRNA in the network is downregulated and shown to be interacting with 9 upregulated genes and 1 downregulated genes, corresponding score of correlation for that microRNA is 90% and so forth. Odyssey uses the following formula for calculation of correlation for each node in the network.

 $\textit{Correlation Score} \ \% = \ \textit{Number of inversely interacting nodes / Number of total interactions}$

According to this formula, "Change node color by correlation percentage" option greys out positively or negatively correlated nodes based on selection based on calculated correlation score.

Network Visualization



Odyssey generates an interactive network where the nodes and correspondingly connected edges can be moved to obtain a user-tailored view. Users can use keyboard arrow buttons or mouse drag to move around the network. Mouse wheel or implemented minus and plus signs at the bottom-right corner of the network can be utilized to zoom-in to or out.

There are two options to download the visualized network in Odyssey. First option is to download the network in .png format specified as "*Export as.png*". This option yields a non-interactive network where as "*Export as .html*" option yields an interactive version of the network as is possible while using the application.

Two more download buttons are implemented directly below the network. First of these download button is "*Network Properties*".

Row.names	Degree	Correlation	logFC	AveExpr	t	P.Value	adj.P.Val	В	TargetScan	miRNet
BMP2K	3	67%	1.029	6.904	6.028	0	0.004	0.547	Yes	Yes
C1GALT1	3	33%	1.006	6.859	6.22	0	0.004	0.779	Yes	Yes
CDC6	3	33%	-0.802	6.522	-6.096	0	0.004	0.63	Yes	Yes
CPEB2	4	50%	-0.855	4.846	-3.988	0.004	0.027	-2.241	Yes	Yes
CTTNBP2NL	3	67%	1.148	5.931	8.245	0	0.001	2.949	Yes	Yes
DNMT3A	3	33%	-0.85	5.63	-5.444	0.001	0.007	-0.191	Yes	Yes
DST	3	33%	1.184	7.48	7.949	0	0.001	2.661	Yes	Yes
EIF4E3	3	67%	1.027	5.313	5.857	0	0.005	0.336	Yes	Yes
ENC1	3	33%	-0.815	4.655	-5.158	0.001	0.009	-0.568	Yes	Yes
ERO1LB	3	67%	1.406	4.974	6.827	0	0.002	1.481	Yes	Yes
EXT1	3	67%	1.068	7.702	8.646	0	0.001	3.325	Yes	Yes
FAXC	3	67%	-0.845	5.138	-4.569	0.002	0.015	-1.386	Yes	Yes
FOXP2	4	50%	1.165	3.11	7.955	0	0.001	2.666	Yes	Yes
HAS2	4	50%	-2.293	5.785	-14.647	0	0	7.521	Yes	Yes
HOOK1	3	33%	1.563	2.944	9.609	0	0.001	4.167	Yes	Yes
HSA-MIR-23C	28	61%	-0.326	1.203	-0.572	0.59	0.998	-4.65	Yes	Yes
HSA-MIR-26B-5P	42	57%	-0.504	2.019	-1.185	0.284	0.998	-4.575	Yes	Yes
HSA-MIR-4465	42	43%	0.528	1.941	1.91	0.109	0.998	-4.474	Yes	Yes
HSA-MIR-98-5P	22	45%	0.657	1.879	1.002	0.358	0.998	-4.6	Yes	Yes
ICOS	3	67%	-1.706	4.878	-10.939	0	0	5.206	Yes	No

Network Properties file is downloaded as displayed above (truncated). Apart from the differential expression results of the nodes on the network, degree and correlation score of the nodes are also added in this file to supply a comprehensive info file.

Correlation plot draws a scatterplot between the quantitative variables correlation score% ~ logFC separately for miRNA and mRNA data. We aim to provide insight into experimental settings where miRNA – gene interaction is plotted with parameters mentioned.

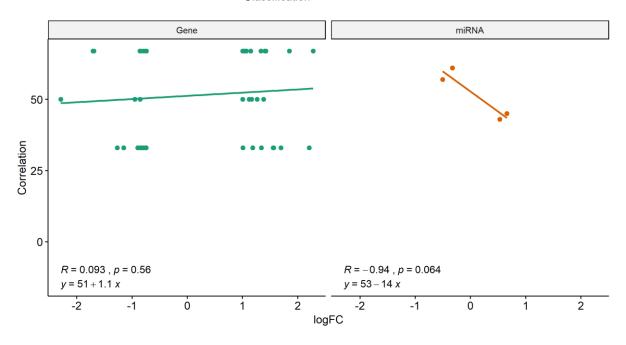
	Upregulated Node #	Downregulated Node #
Correlation Score >= 50%		
Correlation Score < 50%		

Fisher's exact test is conducted separately for miRNA and gene data according to the contingency table above. Therefore, scatterplot and the fisher's exact test is conducted to reveal any significant association between correlation score and expression levels of the nodes.

Fisher's test p value for Genes: 0.542 Fisher's test p value for miRNAs: 0.333

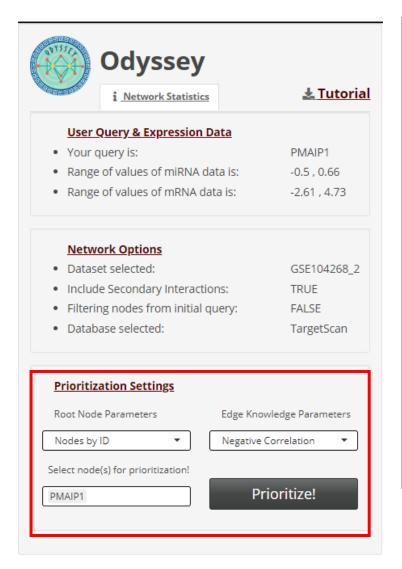
PMAIP1 GSE104268_2





Prioritization

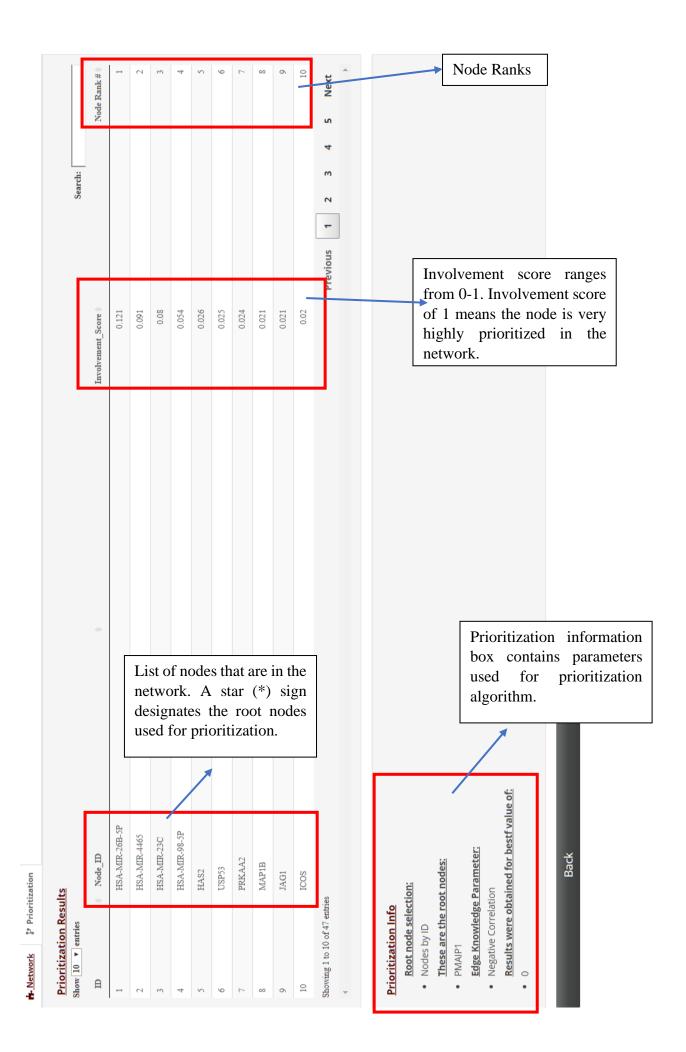
Odyssey's implementation of KNGP algorithm [5]. KNGP algorithm is a Random Walk algorithm that requires root node parameter, node parameter and edge parameter defined for each network. Root nodes are defined as start point(s) of the random walk that can be selected manually from node ID table or automatically by node degree in the network. Node parameter is weight of nodes defined as absolute logFC value calculated in the differential expression analysis step. Finally, edge parameter is interaction weight between nodes that can be selected to favor negatively correlated node pairs or positively correlated node pairs. Together, these parameters define the start point, direction of random walk and finally the list of results that contain prioritization score of each node within the network.



Odyssey aims to highlight biologically "important" nodes from a large network that is otherwise challenging to analyze. After prioritization, prioritization scores are obtained for each node, and the scores are ordered ascending. From the list of ordered scores, quantile values are calculated and nodes with prioritization score above 90 percentile are displayed in the network in square shape. Other nodes are grouped and merged in clusters according to quantile values. Nodes with prioritization score within 75th percentile and 90th percentile clustered within are "Medium" cluster and the rest of the nodes are clustered in "Low" cluster.

"Change network arrangement" menu is used to switch between prioritized network view and the initial network view.





High - 10% Medium - 25%

Low

0

Network & Prioritization

Export as .png

(E) (C)

References

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