Patterns, Volume 5

## Supplemental information

## RummaGEO: Automatic mining of human

#### and mouse gene sets from GEO

Giacomo B. Marino, Daniel J.B. Clarke, Alexander Lachmann, Eden Z. Deng, and Avi Ma'ayan

# **Supplemental Information**

for

#### RummaGEO: Automatic Mining of Human and Mouse Gene Sets from GEO

Giacomo B. Marino<sup>1</sup>, Daniel J. B. Clarke<sup>1</sup>, Eden Z. Deng<sup>1</sup>, Avi Ma'ayan<sup>1,\*</sup>

<sup>1</sup>Mount Sinai Center for Bioinformatics, Department of Pharmacological Sciences, Department of Artificial Intelligence and Human Health, Icahn School of Medicine at Mount Sinai, New York 10029, NY USA

\*To whom correspondence should be addressed:

Lead contact and corresponding author: avi.maayan@mssm.edu

#### Figure S1



Fig. S1 Significantly enriched terms from selected Enrichr libraries varying based on the cutoff number of genes.

Figure S2



**Fig. S2 RummaGEO kinase and transcription factor libraries partial intersection benchmarking. A.** Scaled rank (0 highest rank, 1 lowest rank) for transcription factor benchmarking libraries as computed by the Fisher's exact test; **B.** Deviation of the cumulative distribution for scaled ranks of each transcription factor from uniform distribution (Kolmogorov-Smirnov test for goodness of fit compared to uniform distribution: ChEA 2022 p = 3.83E-35; TFpertGEO1000 p = 1.07E-24; TFpertGEO200 p = 2.56E-21; Cusanovich shRNA TFs p =5.47E-01; Single-TF Perturbations p = 2.01E-25; ENCODE TF ChIP-seq 2015 p = 1.01E-10; TFpertGEOdn p =4.33E-19; TFpertGEOup p = 6.22E-21; **C.** 5,000 bootstrapped curves with downsampled negative class were generated to compute mean receiver operating characteristic (ROC) curves and mean area under the ROC curves (AUC) for transcription factors. **D.** Scaled rank (0 highest rank, 1 lowest rank) for kinase benchmarking libraries as computed by Fisher's exact test; **E.** Deviation of the cumulative distribution for scaled ranks of each kinase from uniform distribution (Kolmogorov-Smirnov test for goodness of fit compared to uniform distribution: PTMsigDB drugtarget signatures p = 1.05E-03; L1000FWD kin targets updn p = 1.06E-08; KEA 2015 p =1.14E-03; single kinase perts from GEO updn p = 1.50E-01;

random P = 5.59E-01; **F.** 5,000 bootstrapped curves with downsampled negative class generated to compute mean receiver operating characteristic (ROC) curves and mean area under the ROC curves (AUC) for kinases.

### Figure S3

		Gene set search	PMC search	Table title search	Download	About	9,643 sets analyzed			
Term	PMC5534941-tp2017110x1	Search gene sets	Query extracted	d gene set table titles to fir	id relevant gene	sets.				
try an e	example: neuron, CRISPR, PBMC									
After ru	ummaging through 731,905 ge	ene sets. Rummagene	found your	search term in the table	titles of 2 gene	e sets.				
						Sear	ch:	٩	8	Î
Term							Gene Set			
PMC5	<u>534941</u> -tp2017110x1.docx-6-Alzheimer_;	s_disease					VIEW GENE SET (42)			
PMC5	<u>534941</u> -tp2017110x1.docx-6-Alzheimer_;	s_disease_and_lipids					VIEW GENE SET (22)			
				1						

Fig. S3 Alzheimer's gene set on Rummagene (use case 1).

#### Figure S4

			Gene set sear	ch PubMed	search Meta	data sea	irch	Down	load L	lser Man	ual	Abou	ıt <b>4,5</b>	5 <b>02</b> sets ana	yzed			
	Input: <u>Gene set (42 genes)</u>																	
Matching Gene Sets					Common Terms in Matching Gene Sets								Enrichr Terms					
Af	After rummaging through 135,264 human gene sets. RummaGEO																	
					Minimum Silh	ouette Sco	re: <b>-1 </b>							<b>Q</b> ⊗	₹	Нуро	othesis Generation 🛔	
	GEO Series	PMID	Title	Condition 1	Condition 2	Direction	Platform	Date	Gene Set Size	Overlap	Odds	PValue	AdjPValue	Silhouette Sc	ore Hyp	othesis	Enrichr Terms	
	<u>GSE103510</u>	N/A	Pharmacologic inhibition of STAT5 in AML	<u>molm 13 ac 4 130 cd3</u> <u>cd4 + cd13 (+) cd14</u> <u>cd15 cd19 cd33 cd34</u> <u>cycd68 hla dr ftl3 itd</u> <u>mll af9 (5 âµm)</u> <u>human aml cell line</u>	<u>mv4 11 ac 4 130 cd3</u> <u>cd4 + cd5 cd8 cd10</u> <u>cd14 cd15 cd19 cd33</u> <u>cd34 ftl3 itd mll af4 (5</u> <u>âµm) human aml cell</u> <u>line</u>	Up	<u>GPL11154</u>	2018- 09-03	<u>1755</u>	<u>19</u>	15.9	9.23e-19	1.27e-13	0.92		C	*	
	<u>GSE103510</u>	N/A	Pharmacologic inhibition of STAT5 in AML	molm 13 dmso cd3 cd4 + cd13 (+) cd14 cd15 cd19 cd33 cd34 cycd68 hla dr ftl3 itd mll af9 human aml cell line	mv4 11 ac 4 130 cd3 cd4 + cd5 cd8 cd10 cd14 cd15 cd19 cd33 cd34 ftl3 itd mll af4 (5 âµm) human aml cell line	Up	<u>GPL11154</u>	2018- 09-03	<u>1796</u>	<u>18</u>	14.7	3.78e-17	2.61e-12	0.92		C	*	
	<u>GSE221327</u>	<u>37063293</u>	Multi-omics analyses reveal CIpP activators disrupt essential mitochondrial pathways in triple-negative breast cancer	wt sum159 onc201 (1 hr) (bio. rep. time 1 hour cell line triple negative breast cancer 10 um	<u>clpp ko sum159</u> <u>onc201 (1 hr) (bio.</u> rep. time 1 hour cell line triple negative breast cancer 10 um	Up	<u>GPL24676</u>	2023- 04-01	<u>1353</u>	<u>15</u>	16.3	6.88e-15	3.16e-10	-0.36		C	*	
	<u>GSE103510</u>	N/A	Pharmacologic inhibition of STAT5 in AML	<u>mv4 11 dmso cd3 cd4</u> + cd5 cd8 cd10 cd14 cd15 cd19 cd33 cd34 ftl3 itd mll af4 human aml cell line	<u>molm 13 dmso cd3</u> <u>cd4 + cd13 (+) cd14</u> <u>cd15 cd19 cd33 cd34</u> <u>cycd68 hla dr ftl3 itd</u> <u>mll af9 human aml</u> cell line	Down	<u>GPL11154</u>	2018- 09-03	<u>1203</u>	<u>14</u>	17.1	3.40e-14	1.17e-9	0.92		C	\$	

Fig. S4 Results of submitting the Alzheimer's gene set from Rummagene on RummaGEO (use case 1).

## Figure S5

			Gene set se	earch PubM	ed search M	etadata s	earch	Dow	nload	User Ma	nual	Abou	ut <b>4</b> ,5	5 <b>02</b> set	ts analyz	ed		
Ir	nput: <u>Gene</u>	<u>e set (301</u>	<u>genes)</u>															
Matching Gene Sets					Common Terms in Matching Gene Sets									Enrichr Terms				
After rummaging through 135,264 human gene sets. RummaGEO 🚺 found 80,728 statistically significant matches.																		
					Minimum	Silhouette S	core: -1 🔵			<b>T</b>				۹	8	$\overline{\mathbf{x}}$	Hypothesis Generation	
	GEO Series	PMID	Title	Condition 1	Condition 2	Direction	Platform	Date	Gene Set Size	e Overlap	Odds	PValue	AdjPValue	Silhou	uette Score	e Hypoth	esis Enrichr Terms	
	<u>GSE68836,</u> <u>GSE68847</u>	<u>29513652</u>	BRCA1, R-loops and Recombination defects in Ewing's sarcoma (RNA-seq)	imr90 etop cell line human fetal lung fibroblasts growth protocol cells grown dmem supplemented 10%fbs.protocol 61¼m etoposide hours	tc32 cell line ewing' sarcoma growth protocol cells grown rpmi 40 supplemented 10%fbs prototcol	Down	<u>GPL11154</u>	2018- 03-09	<u>1916</u>	<u>204</u>	22.0	7.41e-235	1.02e-229		0.48	C	4	
	<u>GSE68836,</u> <u>GSE68847</u>	<u>29513652</u>	BRCA1, R-loops and Recombination defects in Ewing's sarcoma (RNA-seq)	imr90 etop cell line human fetal lung fibroblasts growth protocol cells grown dmem supplemented 10%fbs protocol 61¼m etoposide hours	ews502 etop cell line ewing: sarcoma growth protocol cells grown rpmi 40 supplemented 10%fbs.prototcol 0.251¼m etoposide hours	Down	<u>GPL11154</u>	2018- 03-09	<u>1724</u>	<u>198</u>	23.7	3.51e-233	2.42e-228		0.48	C	\$	
	<u>GSE161752</u>	<u>33489936</u>	Profiling the blood compartment of Hematopoietic Stem Cell Transplant patients during Human Cytomegalovirus reactivation	<u>pbmc high viremia</u> <u>hsct</u>	fibroblasts.hpi fibroblast.infected hcmv.tb40	Up	<u>GPL18573,</u> <u>GPL24676</u>	2020- 11-18	<u>1859</u>	<u>191</u>	21.2	1.31e-213	6.03e-209		0.090	C	\$	

Fig. S5 Results from submitting SenoRanger gene set on RummaGEO (use case 2).