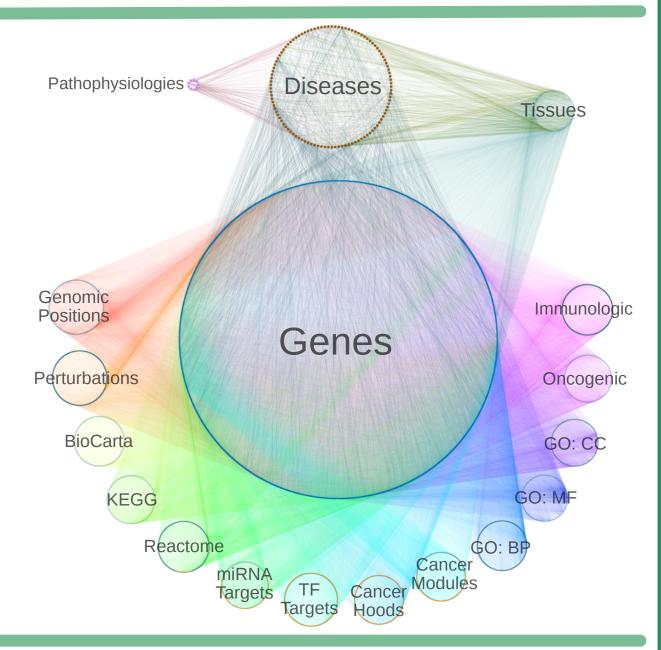
## Daniel Himmelstein, Leo Brueggeman & Sergio Baranzini present Repurposing drugs on a heterogeneous network

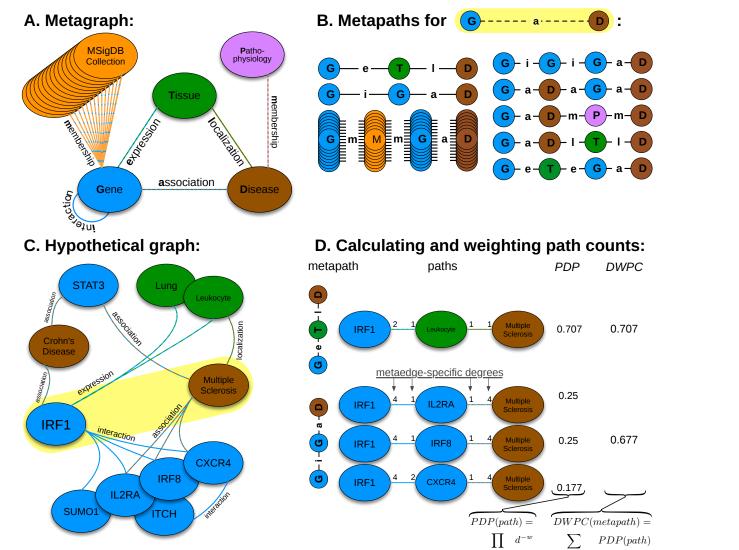
Last year, we introduced *heterogeneous network edge prediction* (HNEP) to <u>predict disease-associated genes</u>.

Heterogeneous networks contain multiple node and edge types.

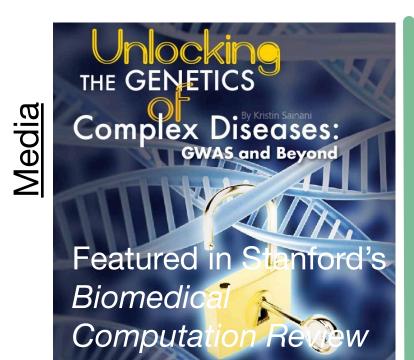
Our network contained 40,343 nodes (of 18 types) and 1,608,168 edges (of 19 types).

**EP** Method





Forthcoming in *PLOS Computational Biology* preprint on *bioRxiv* [doi:10.1101/011569]

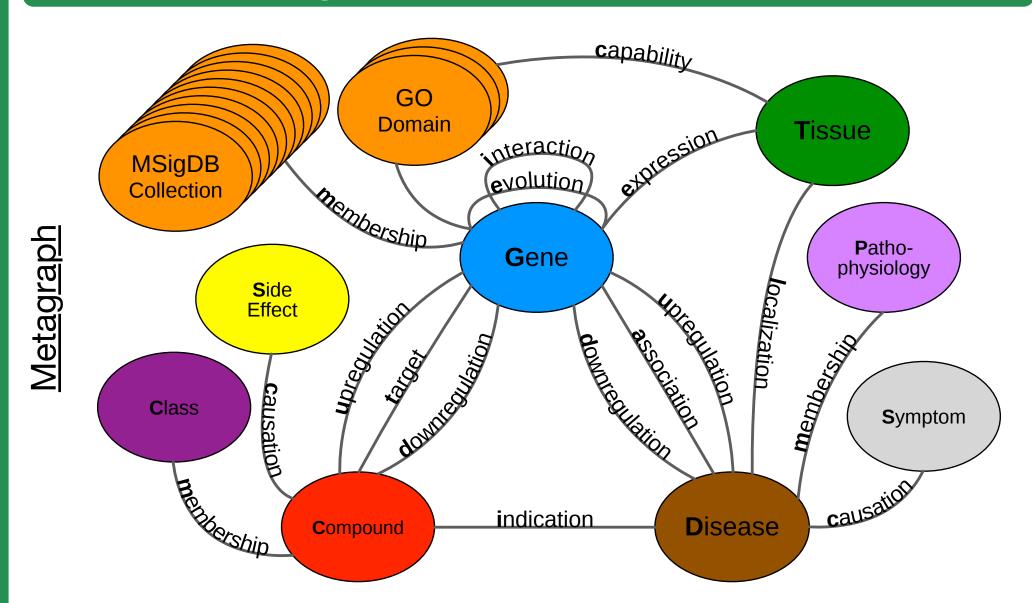


### Predictions online at het.io

net.io Home	HNLP Disease Gen	es ▼ Media	Baranzini Lab ▼				
Prediction  Disease Onte	EFO EFO:0003885	e sclero	sis				
where the levels ind	licate whether the gene wa	s a primary anno	all prediction. The existence station for a high (± HC-P) or	r low-confidence	(± LC-P) associa	ation, or a se	econdary
			ion across all diseases for a				
sclerosis, that the ge	ene is associated with. The	average predict		gene is showed	by mean_predic	ction.	diction
Show 10 : entr	ene is associated with. The	average predict	ion across all diseases for a	gene is showed	Search:	prec	
Show 10 : entr	ene is associated with. The ies  \$\displayset{gene_code}\$	average predict	ion across all diseases for a  the other_associations	gene is showed	Search: _prediction		diction
Show 10 : entr	ene is associated with. The  ies  \$\text{gene_code}\$  HGNC:5969	average predict	on across all diseases for a  other_associations	gene is showed	Search: _prediction % 7%	⇒ prec 42.7 42.6	diction
Show 10 : entr gene_symbol IL12A STAT4	ene is associated with. The  gene_code  HGNC:5969  HGNC:11365	average predict  the status  ± LC-P	on across all diseases for a  other_associations  2 5	\$ mean 4.312 12.53	Search:  prediction  % 7%		diction 771% 602%
Show 10 : entr gene_symbol IL12A STAT4 IL12B	ene is associated with. The  gene_code  HGNC:5969  HGNC:11365  HGNC:5970	average predict  the status  ± LC-P	on across all diseases for a  to other_associations  2  5  5	\$ mean 4.312 12.53 24.64	Search:  prediction  %  7%  22%	\$\times \text{prec}  \text{prec}  \text{42.6}  \text{41.6}  \text{38.5}	diction 771% 602% 675%
Show 10 : entr gene_symbol IL12A STAT4 IL12B PTPN2	ene is associated with. The ies  gene_code  HGNC:5969  HGNC:1365  HGNC:5970  HGNC:9650	average predict  the status  ± LC-P	on across all diseases for a  the other associations  2  5  5  4	\$\text{mean} 4.312   12.53   24.64   4.699	Search:  prediction  % 7% 2% %	\$ prec 42.7 42.6 41.6 38.5 38.5	diction 771% 602% 671%
Show 10 : entr gene_symbol IL12A STAT4 IL12B PTPN2 IL10	ene is associated with. The ies  \$ gene_code	average predict  status  ± LC-P  -  + HC-P  -	on across all diseases for a  the other_associations  2  5  4  4	\$\phi\$ mean 4.312 12.53 24.64 4.699 8.114	Search:  prediction  %  7%  8%  %  %  1%	\$ prec 42.7 42.6 41.6 38.5 38.3 36.0	diction 771% 802% 875% 845%
sclerosis, that the ge Show 10 : entr gene_symbol IL12A STAT4 IL12B PTPN2 IL10 IL2RA	ene is associated with. The ies  gene_code  HGNC:5969  HGNC:11365  HGNC:5970  HGNC:9650  HGNC:5962  HGNC:6008	average predict  status  ± LC-P  -  + HC-P  -	on across all diseases for a  other_associations  contact the cont	\$\phi\$ mean 4.312 12.53 24.64 4.699 8.114 18.68	Search:  prediction % 7% % % % % %	\$ prec 42.7 42.6 41.6 38.5 36.0 31.4	diction 771% 602% 675% 671% 645%
Show 10 : entr gene_symbol IL12A STAT4 IL12B PTPN2 IL10 IL2RA IRF5	ene is associated with. The les  gene_code  HGNC:5969  HGNC:11365  HGNC:5970  HGNC:59650  HGNC:5962  HGNC:6008  HGNC:6120	average predict  status  ± LC-P  -  + HC-P  -	on across all diseases for a  other_associations  2  5  4  4  5  5	\$\phi\$ mean 4.312 12.53 24.64 4.699 8.114 18.68 8.140	Search:	\$\times \text{prection}\$.  \$\phi \text{ prection}\$.  42.7  42.6  41.6  38.5  36.0  31.4  29.4	diction 771% 602% 675% 671% 645% 025%

Now in 2015, we will use this data integration approach to <u>repurpose drugs</u> on a heterogeneous network.

### Planning the Network Construction



	Туре	Resource
	Compound	DrugBank
	Disease	Disease Ontology
SS	Gene	Entrez Gene
Nodes	Tissue	Uberon
$\geq$	Gene Set	MSigDB
	Side Effect	UMLS
	Pathophysiology	Manual
	Symptom	MeSH

Standardized terminologies:

- provide a scalable framework for data integration
- prevent redundancy
- enable semantic data

Source	Target	Туре	Resource	
Compound	l Disease	Indication	MEDI	
Compound	I Disease	Indication	LabeledIn	Ideal resources are:
Compound	I Gene	Expression	LINCS	<ul> <li>high-throughput</li> </ul>
Compound	Side Effect	Causation	SIDER 2	<ul> <li>systematic</li> </ul>
Compound	Side Effect	Causation	OFFSIDES	<ul> <li>unbiased</li> </ul>
Disease	Gene	Target	ChEMBL	<ul> <li>aggregately diverse</li> </ul>
Disease	Gene	Association	GWAS Catalog	
Disease	Gene	Expression	STAR-GEO	
Disease	Pathophysiology	Membership	Manual	
Disease	Symptom	Causation	Human symptom	nsdisease network
Gene	Gene	Interaction	Human Interacto	me Project
Gene	Gene	Interaction	The Incomplete I	Interactome
Gene	Gene	Evolution	Evolutionary Rat	e Covariation
Gene	Gene Set	Membership	MSigDB	
Gene	Tissue	Expression	GNF Gene Expre	ession Atlas

And you can follow in realtime and get paid to participate.

# ThinkLab

thinklab.com/p/rephetio doi:10.15363/thinklab.4

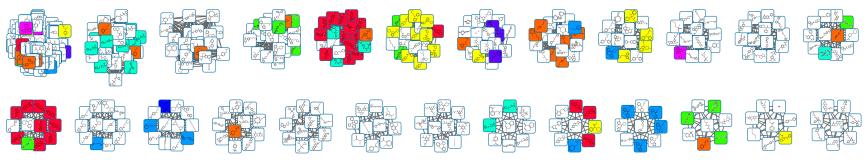


#### ThinkLab is:

- massively collaborative all are welcome
- open science all content is CC-BY
- incentivized contributions are rewarded
- productive scientific markdown editor
- efficient code and results public upon commit

### Results (as of March 2015)

We analyzed **SIDER 2** and investigated its strengths and weaknesses as well as pharmacological utility.



Side-effect similarity modules were concordant with structural similarity modules (colored).

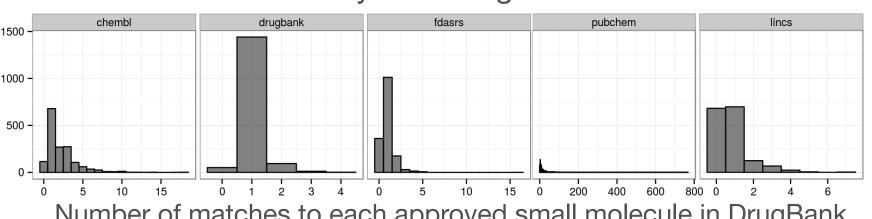
git.dhimmel.com/SIDER2

We created a user-friendly service to retrieve **Gene Ontology annotations** with optional propagation.

Propagated	Unpropagated
Entrez	Symbol
All Genes	Protein-coding Genes

git.dhimmel.com/gene-ontology

We mapped compound vocabularies to DrugBank using **UniChem** to enable fuzzy matching.



Number of matches to each approved small molecule in DrugBank git.dhimmel.com/drugbank/unichem-map.html

#### Acknowledgements

We would like to thank our ThinkLab contributors (thinklab.com/p/rephetio/leaderboard) and Alex Pico for the SIDER visualization. This material is based upon work supported by the National Science Foundation under Grant No. 1144247 to DSH and the National Institute of Neurological Disorders and Stroke under R01 NS088155-01 to SEB.