

Data (drug information)

- Efficacy of each compound for each cell line
 - ① IC50
 - ② Slope of the dose-response curve for drug
 - ③ Maximum cells killed (percentage) with drug
 - Y Estimated total synergy between drug A and drug B in combination (for training)
- Drug chemical information
 - ⑤ MW - Molecular weight
 - ⑥ HBA - H-bond acceptors
 - ⑦ HBD - H-bond donors
 - ⑧ cLogP - Calculated log P
 - ⑨ Lipinski - Lipinski's rule of 5

Molecular data

	mutation snp			cnv			methylation			expression levels data		
	C1	C2	C3	C1	C2	C3	C1	C2	C3	C1	C2	C3
GENE1												
GENE2												
GENE3												
GENE4												
GENE5												
GENE6												
GENE7												
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Feature selection; select genes to build regression model for drug-combination synergy

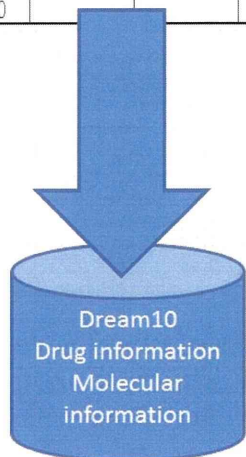
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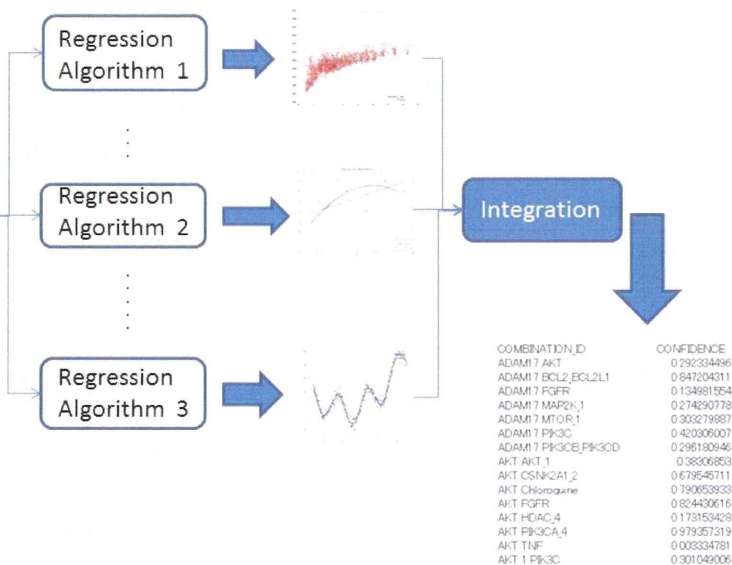
Based on molecular interaction network, we selected informative genes to infer compound synergy effects.

Training data

Combination		Cell line	Drug information					Molecular information			
Drug A	Drug B	Cell line	IC50 Drug A	IC50 Drug B	...	Lipinski Drug B	Synergy	Mutation(SNPS)	Gene 1 in Cell line	...	Expression level Gene 15 in Cell line
D1	D2	C1									
D1	D2	C2									
D2	D3	C10									



We used Xsight that integrate a larger number of algorithms to predict compound synergy effects



Sub challenge 1A round 3 leader board

Q1A

ID	Date name team	Global Correlation	Mean Correlation (all)	STE (all)	Mean Correlation (top 30%)	STE (top 30%)	Mean Correlation (top 20%)	STE (top 20%)	Mean Correlation (top 10%)	STE (top 10%)
5601858	FINCHIPS	0.19	0.27	0.73	0.56	0.54	0.56	0.63	0.57	0.59
5608044	FINCHIPS	0.21	0.28	0.72	0.56	0.54	0.56	0.63	0.57	0.59
5608141	Alex_1	0.29	0.31	0.71	0.47	0.53	0.46	0.53	0.53	0.41
5609574	GMM	0.18	0.21	0.72	0.4	0.58	0.46	0.51	0.45	0.55
5609367	Xtract	0.18	0.25	0.73	0.33	0.72	0.45	0.65	0.29	0.77
5605043	OurTeam	0.32	0.33	0.72	0.42	0.64	0.42	0.65	0.21	0.78
5608863	S.E.R.G.E	0.28	0.25	0.73	0.41	0.64	0.4	0.69	0.42	0.73
5609342	Xtract	0.15	0.26	0.73	0.41	0.69	0.4	0.68	0.43	0.69
5609123	BigHero5	0.21	0.16	0.76	0.26	0.66	0.39	0.58	0.45	0.63
5580961	GodzikLab	0.11	0.2	0.73	0.34	0.74	0.38	0.72	0.52	0.64
							0.38	0.59	0.36	0.6
							0.38	0.7	0.62	0.51
							0.37	0.73	0.24	0.8
							0.37	0.69	0.61	0.51
							0.36	0.69	0.15	0.87
							0.36	0.71	0.58	0.53
							0.35	0.74	0.55	0.62
							0.35	0.54	0.55	0.49
							0.34	0.71	0.51	0.61
							0.34	0.6	0.37	0.55
							0.33	0.46	0.12	0.32
							0.33	0.74	0.33	0.8
							0.32	0.67	0.51	0.65
							0.32	0.67	0.34	0.71
5609124	BigHero5	0.22	0.17	0.74	0.29	0.58	0.32	0.6	0.55	0.53

Among 139 submissions, we are in top 5th (and 8th).

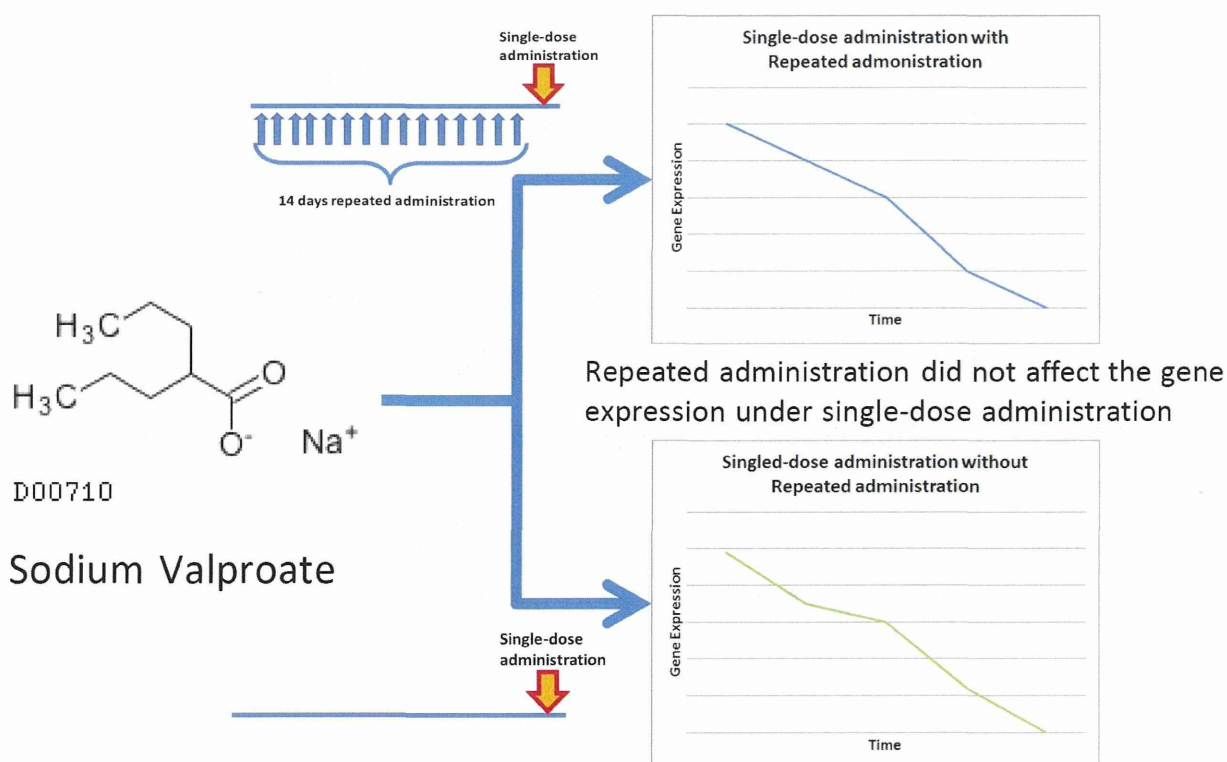
These results demonstrated that our Xsight system successfully infer compound synergy effects from multi-dimensional omics data

Xsight system current status

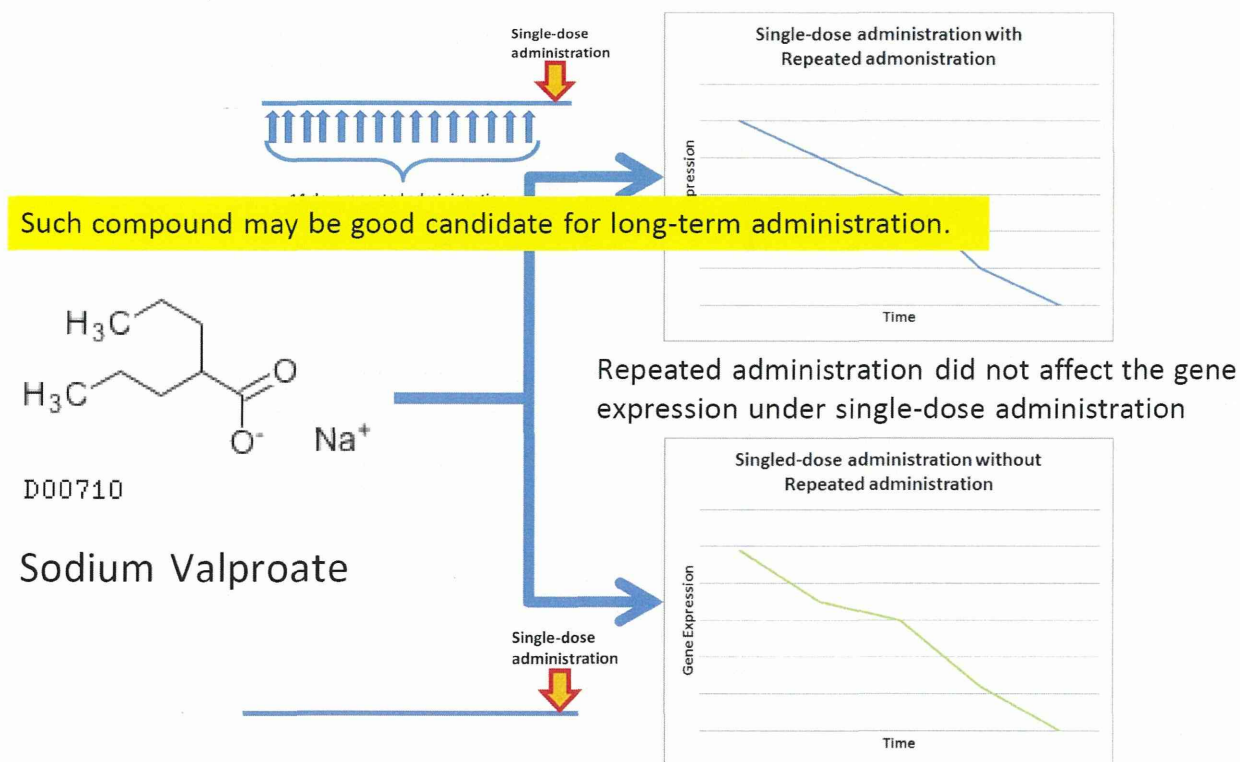
- Xsight system is an ensemble machine-learning based computational system for big data analysis
- Xsight system integrates more than **100** algorithms (e.g., **120** regression methods, **58** binary classifiers, and **51** multiclass classifiers to answer your question.)
- We are now implementing other algorithms (e.g., feature selection methods) on Xsight system.

Application of Xsight system for toxicology

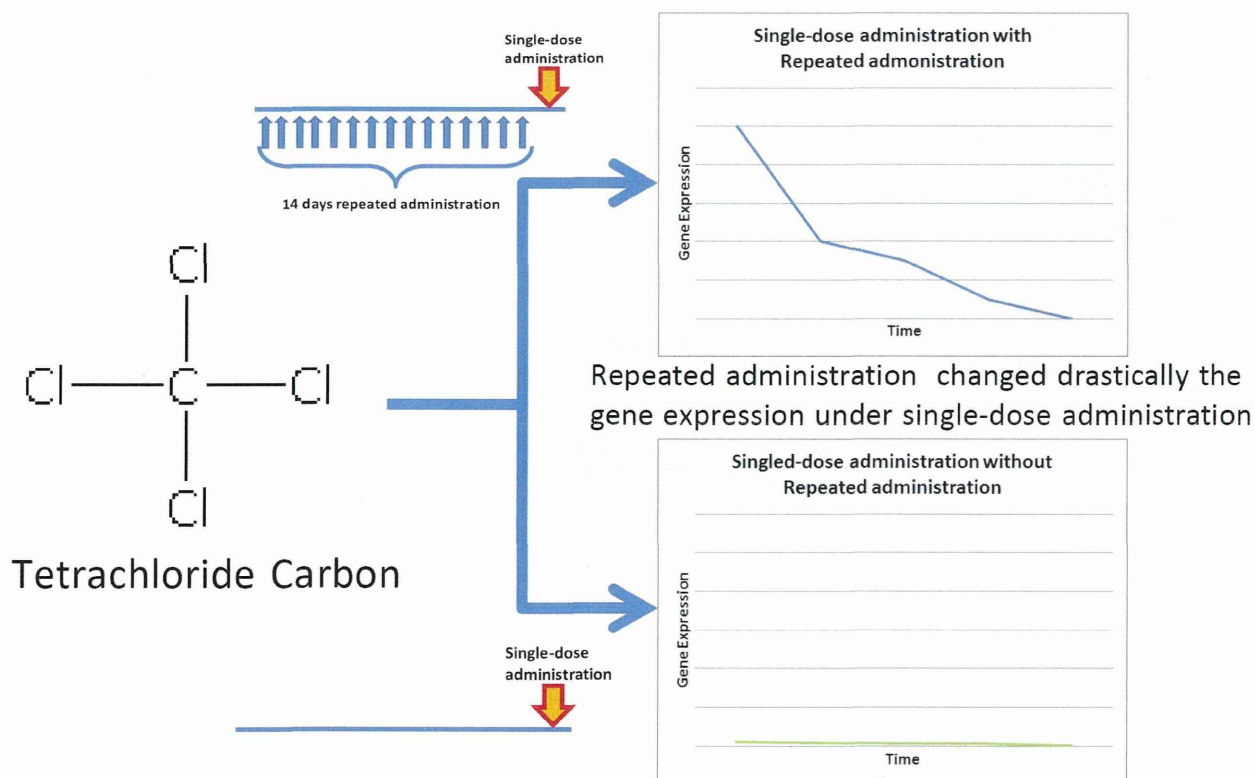
Application of Xsight to predict effect of repeated administration of drug compounds



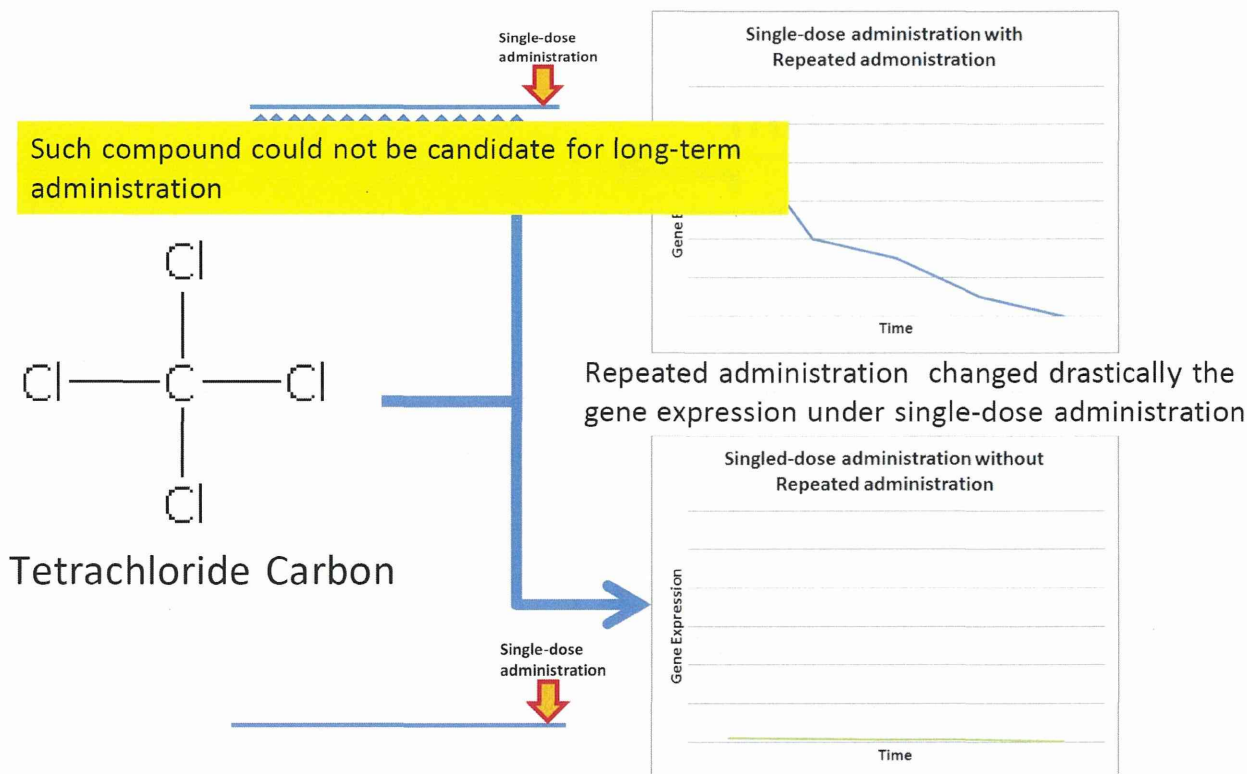
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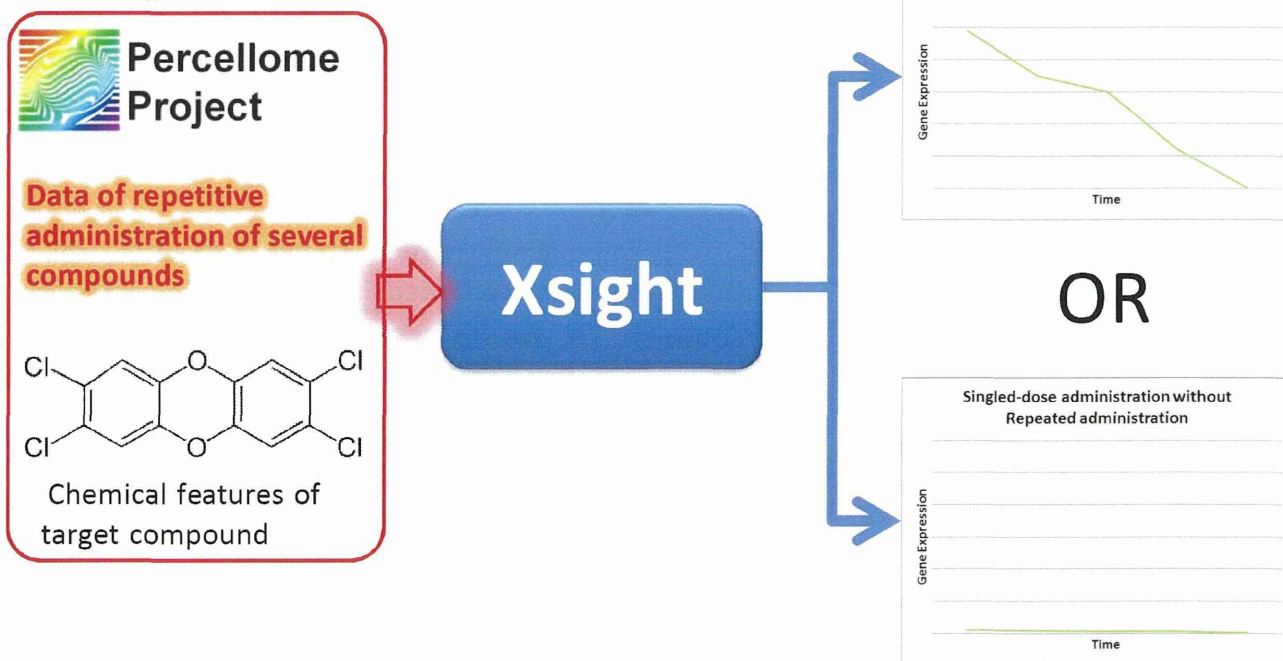


Application of Xsight to predict effect of repeated administration of drug compounds



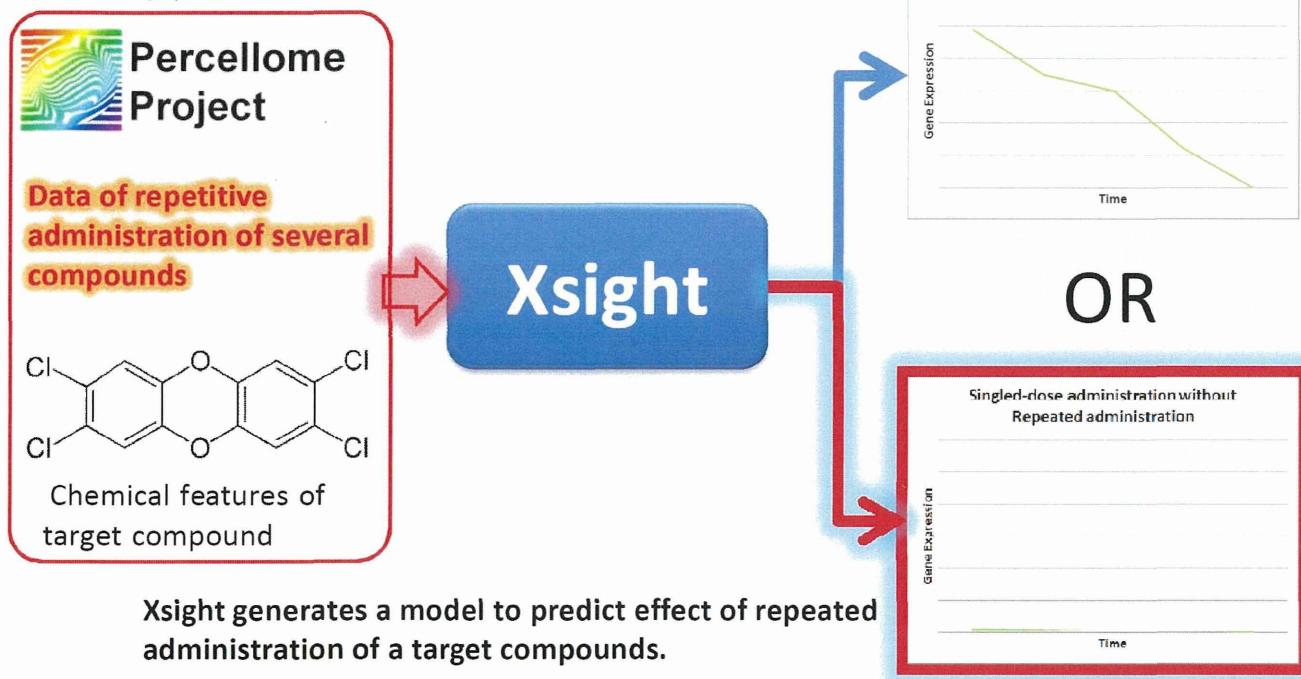
Application of Xsight to predict effect of repeated administration of drug compounds

Based on high-dimensional toxicology data (parcellome, expression data of repetitive administration, chemical structure),



Application of Xsight to predict effect of repeated administration of drug compounds

Based on high-dimensional toxicology data (parcellome, expression data of repetitive administration, chemical structure),



- We developed an ensemble learning system, Xsight, that integrates more than 100 machine learning algorithms.
- We applied Xsight for multi-omics data, DREAM10 data, to test predictive performance of Xsight.
- We are planning to apply Xsight system to predict effects of repeated administration of a compound.

Ⅲ. 研究成果の刊行に関する 一覧表

研究成果の刊行に関する一覧表

雑誌

発表者氏名	論文タイトル名	発表誌名	巻名	ページ	出版年
Juliandi B, Tanemura K, Igarashi K, Tominaga T, Furukawa Y, Otsuka M, Moriyama N, Ikegami D, Abematsu M, Sanosaka T, Tsujimura K, Narita M, Kanno J, Nakashima K.	Reduced Adult Hippocampal Neurogenesis and Cognitive Impairments following Prenatal Treatment of the Antiepileptic Drug Valproic Acid.	Stem Cell Reports	5(6)	996 - 1009	2015
Hieu T Nim, Milena B Furtado, Mauro W Costa, Nadia A Rosenthal, Hiroaki Kitano and Sarah E Boyd.	VISIONET: intuitive visualisation of overlapping transcription factor networks, with applications in cardiogenic gene discovery.	BMC Bioinformatics	16	141	2015
北野宏明	システム・トキシコロジーの展開.	QIGEN eyes	12	7 - 9	2015
北野宏明	システム・トキシコロジーの展開(第2回).	QIGEN eyes	13	7 - 9	2015
Tiago J. S. Lopes, Jason E. Shoemaker, Yukiko Matsuoka, Yoshihiro Kawaoka, Hiroaki Kitano.	Identifying problematic drugs based on the characteristics of their targets.	frontiers in Pharmacology	6	186	2015