

A novel drug with a known mechanism that is superbly selective against a single target: Is this a contributor to reduced drug discovery productivity?

Christopher A. Lipinski
Scientific Advisor, Melior Discovery
clipinski@meliordiscovery.com

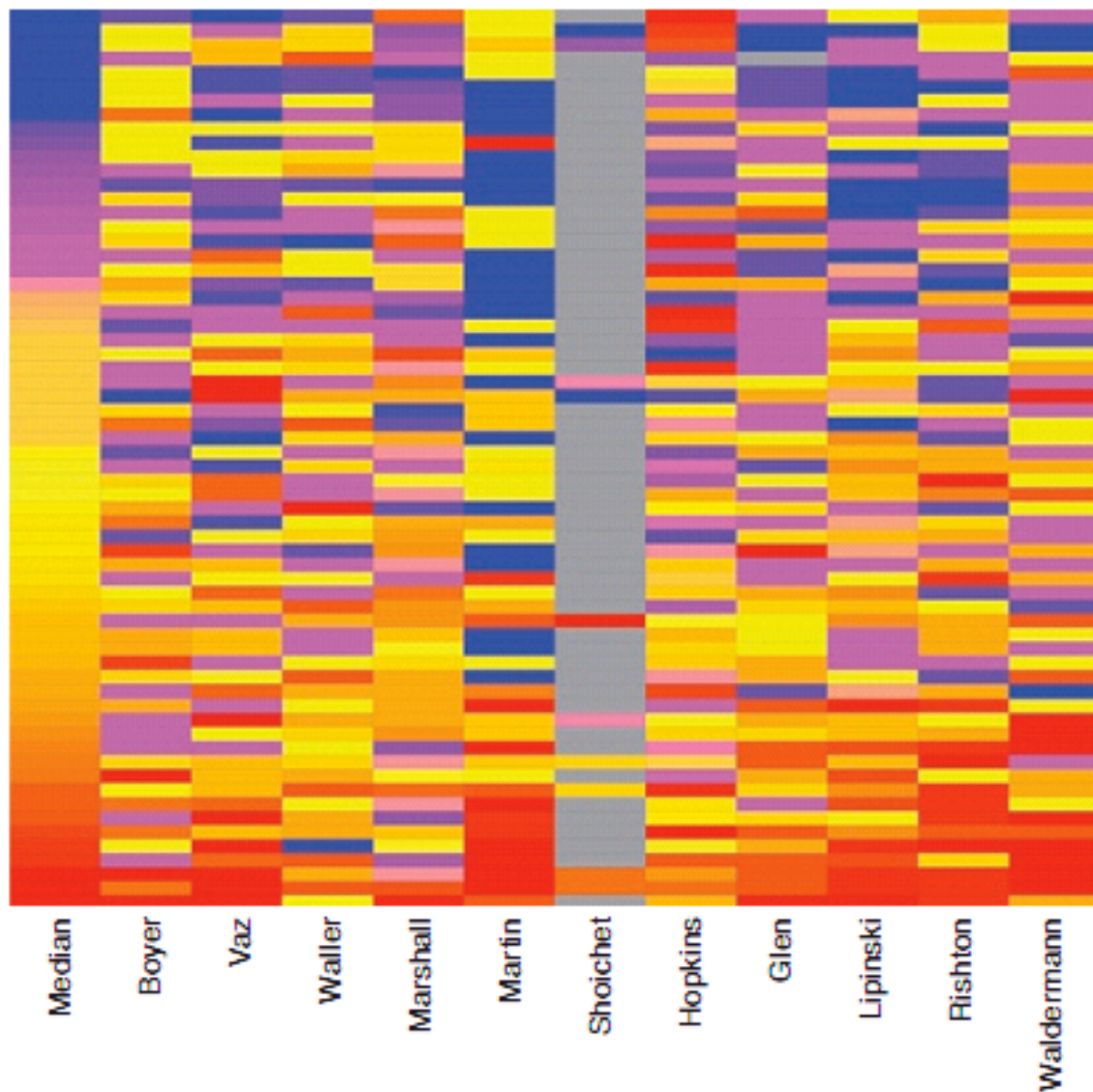
Outline

- How a medicinal chemist looks at drugs
 - annotation
- Beautiful biology ruined by bad chemistry
- Target tractability can change
 - protein – protein interactions as an example
- Rules and filters: why “sharing” is important
 - thiol traps and FDA drugs
 - thiol traps and the Lopac1280 screening library
- Drug repurposing: why “mine” drugs?
 - MLR-1023 as an example
- Enhancing biology chemistry collaboration

Medicinal chemistry annotation

- Start with the structure of a hit. Is it known?
- What do you see in a substructure search?
- Try to understand the chemistry. How were the compounds made and how might they react?
- What is the pattern in the literature for compounds at about 85% similarity
- Look at 10 – 20 compounds and references.
- This type of annotation is almost impossible to do using public domain tools.

Annotation on 64 NIH tools and probes



Oprea et al.
Nature Chemical
Biology 2009,
5(7), 441-447.

Red is high
dubiosity (low
confidence), blue
is low dubiosity
(high confidence)

How do we judge biology value?

- New biology appears in the literature
- Initially the biology looks interesting
- Chemistry in the biology has problems
- How to judge value if the chemistry tools illustrating the biology have potential flaws

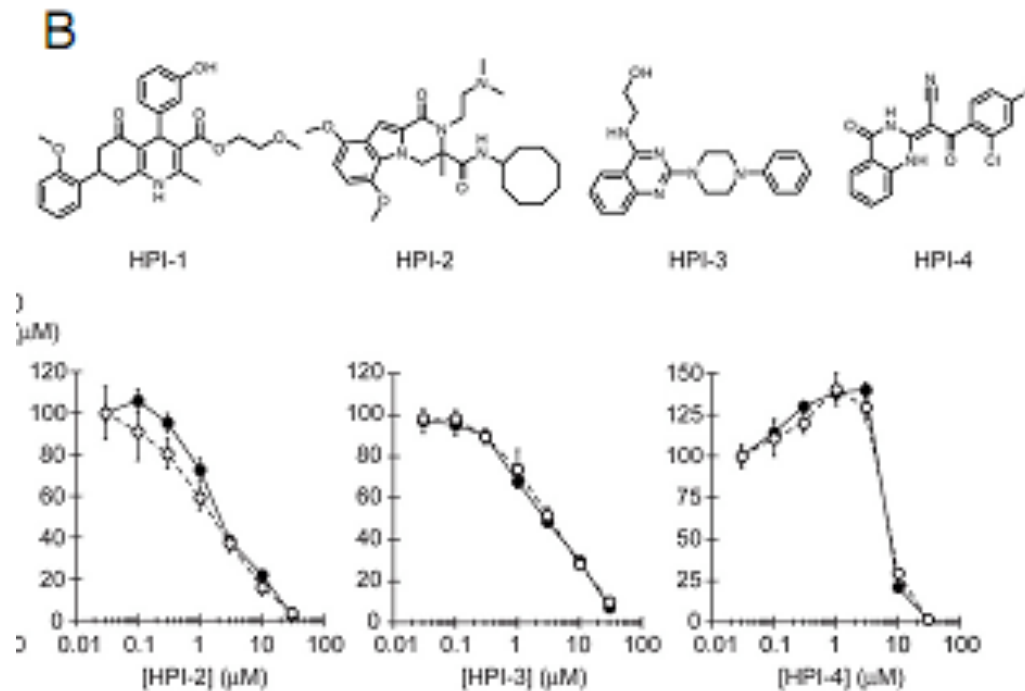
Biology enthusiasm, but chemistry questions

Small-molecule inhibitors reveal multiple strategies for Hedgehog pathway blockade

Joel M. Hyman^{a,1}, Ari J. Firestone^{a,1}, Vivi M. Heine^b, Yun Zhao^{c,d}, Cory A. Ocasio^a, Kyuho Han^a, Mark Sun^a, Paul G. Rack^a, Surajit Sinha^{a,2}, Jason J. Wu^e, David E. Solow-Cordero^e, Jin Jiang^c, David H. Rowitch^b, and James K. Chen^{a,3}

^aDepartment of Chemical and Systems Biology and ⁴Stanford High-Throughput Bioscience Center, Stanford University School of Medicine, Stanford, CA 94305; ^bInstitute for Regenerative Medicine, Howard Hughes Medical Institute, University of California, San Francisco, CA 94143; ^cDepartment of Developmental Biology, University of Texas Southwestern Medical Center, Dallas, TX 75390; and ^dLaboratory of Molecular Cell Biology, Institute of Biochemistry and Cell Biology, Shanghai Institutes for Biological Sciences, Chinese Academy of Sciences, Shanghai 200031, China

Communicated by Matthew P. Scott, Stanford University School of Medicine, Stanford, CA, June 29, 2009 (received for review January 9, 2009)



Hedgehog screening - my comment

4. [Chris](#) on August 12, 2009 2:18 AM writes...

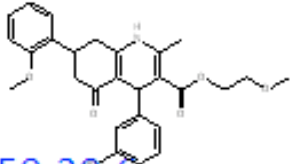
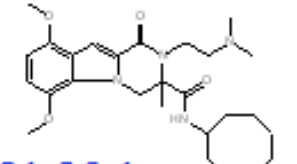
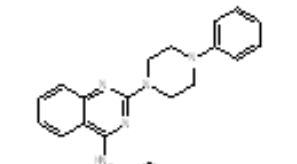
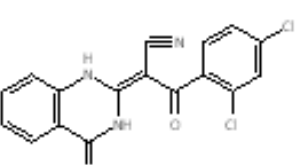
There is a common theme to the four "actives" identified in this paper. They are all commercially available compounds with a CAS registry number and (almost) no literature references. In each case there are commercially available analogs at high similarity again with CAS registry numbers and again no references. I frequently see this pattern in "actives" and it makes me deeply suspicious. What do you think is the probability that a vendor would make a totally novel series just to hit in my new screen? If I were suspicious I might think that the origin of each series was a compound with a flaw that hit enough screens to warrant preparing a flawed analog series. I particularly do not like HPI-4 with a push pull polarized double bond crying out "I am a Michael acceptor please interact with me".

**“actives” all commercially available compounds
.... no literature references suspicious**

A profile to avoid

- The structure of a hit appears in CAS SciFinder
- It is a commercial compound with a CAS Registry Number but no references
- There are multiple compounds at 85% or better similarity
- All the similar compounds are commercially available with no literature references
- **WARNING FLAG**
- This could be a problematic series that proliferates because it is a flawed HTS hit series

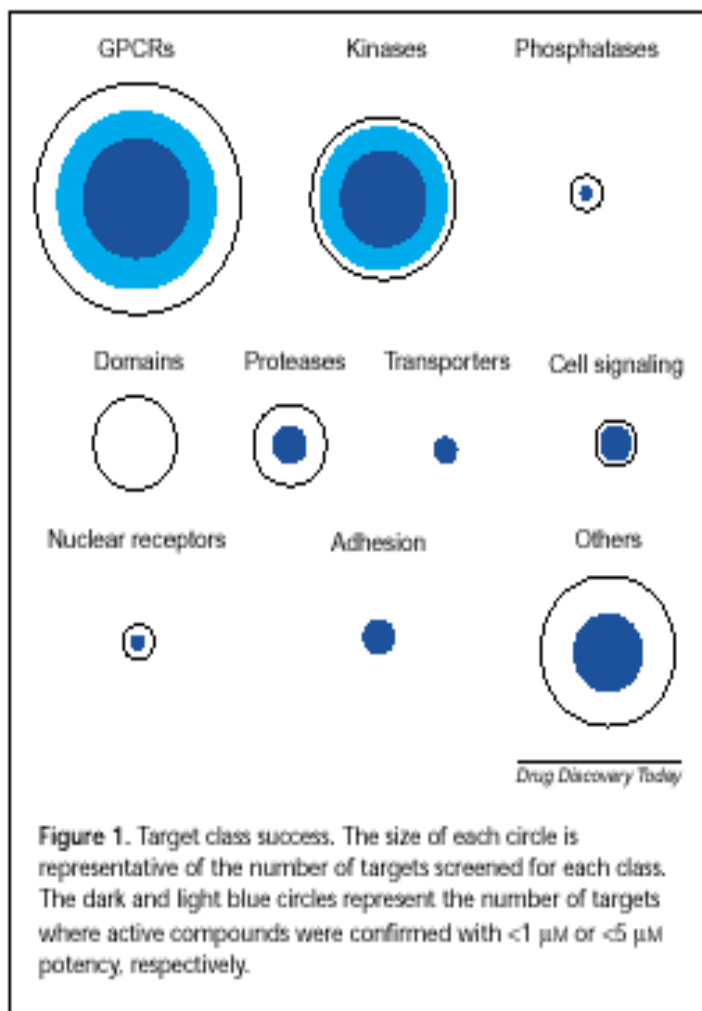
Hedgehog screening – thiol trap filters

CHEMISTRY	NAME	Alarm	smartsfilter_matches
 599150-20-6	HPI-1	failed	<chem>C=CC(=O)O[c,C] ()</chem> <chem>C=CC(=O)[c,C] ()</chem> <chem>Oc1[a;R1][a;R1]a[a;R1][a;R1]1 ()</chem>
 868881-36-1	HPI-2	passed	
 796887-98-4	HPI-3	failed	<chem>[N;!\$([N+]);!\$(NC=[O,N])]c1[a;R1][a;R1]a[a;R1][a;R1]1 ()</chem>
 302803-72-1	HPI-4	failed	<chem>C=CC(=O)[c,C] ()</chem>

Chemical novelty and discovery success

- Biologically active compounds are not evenly distributed in chemical space
- Composition of matter patents drive chemistry toward greater novelty and away fromprecedented chemistry space
- Greater chemistry novelty tracks with decreasing success (greater attrition)
- Modest amount of literature background around an HTS hit is a positive

Not all targets are equal in screening



**Size of colored graphic
= screening success at
Pharmacopeia**

**Reproduced with permission
from “Targeting signal
transduction with large
combinatorial collections”, D. S.
Auld, D. Diller, K. Ho, Drug
Discovery Today, 2002, 7(24)
1206-13.**

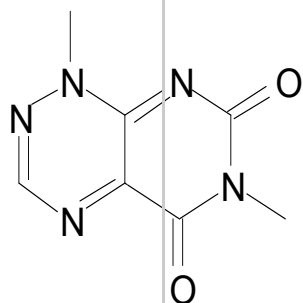
Targets, ligands and the rule of 5

- Beautiful targets and very do-able
 - GPCR's aminergic
 - phosphodiesterases
 - kinases
- Difficult targets but still do-able
 - GPCR's peptidergic
 - proteases
- Hopeless (or nearly so) targets
 - protein protein interactions
 - phosphatases

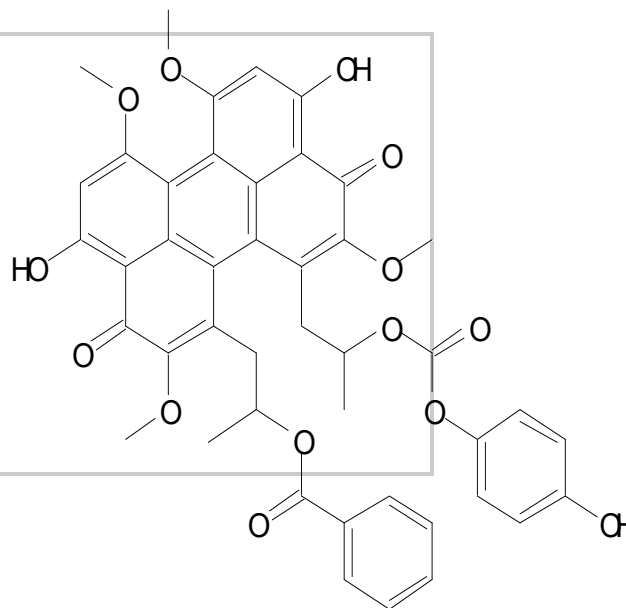
Target tractability can change

- Protein-protein interactions
 - hopeless from an HTS screening viewpoint
- Scientific advances
 - fragment screening
 - SAR by nmr and x-ray
 - Bcl-2 family success from Abbott

Protein protein ligand garbage



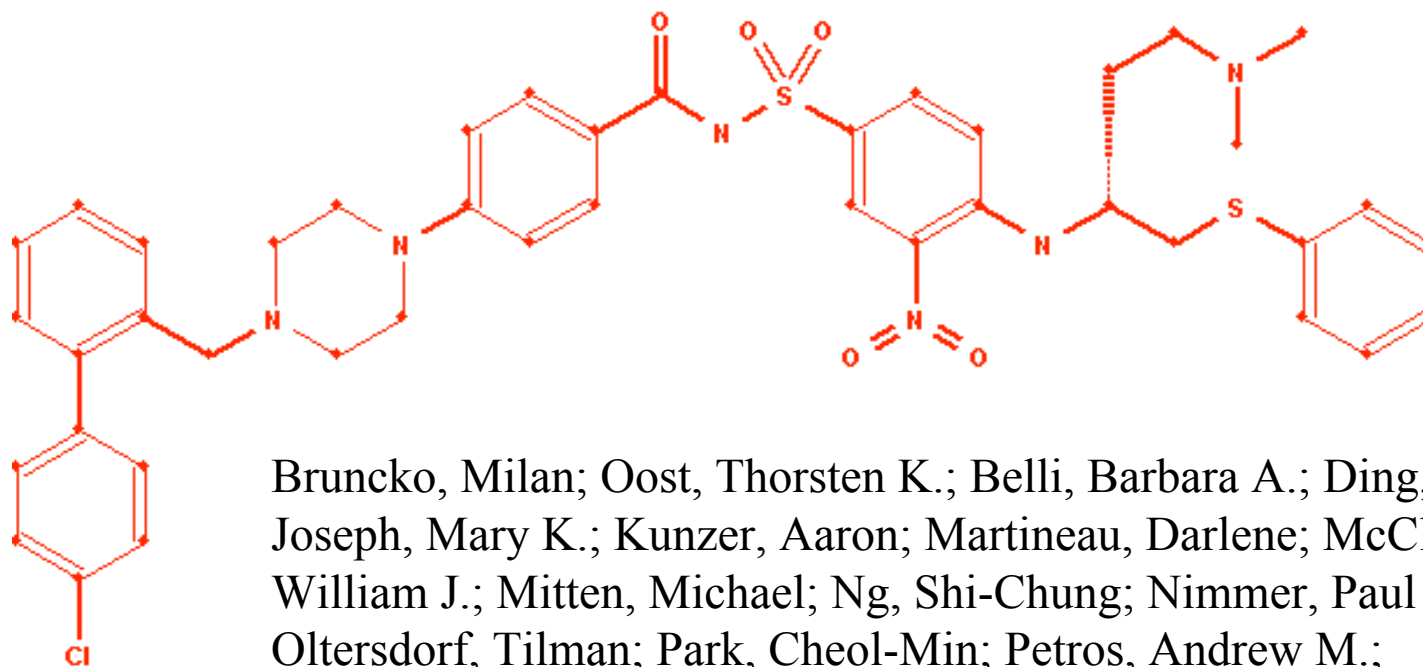
84-82-2



121263-19-2

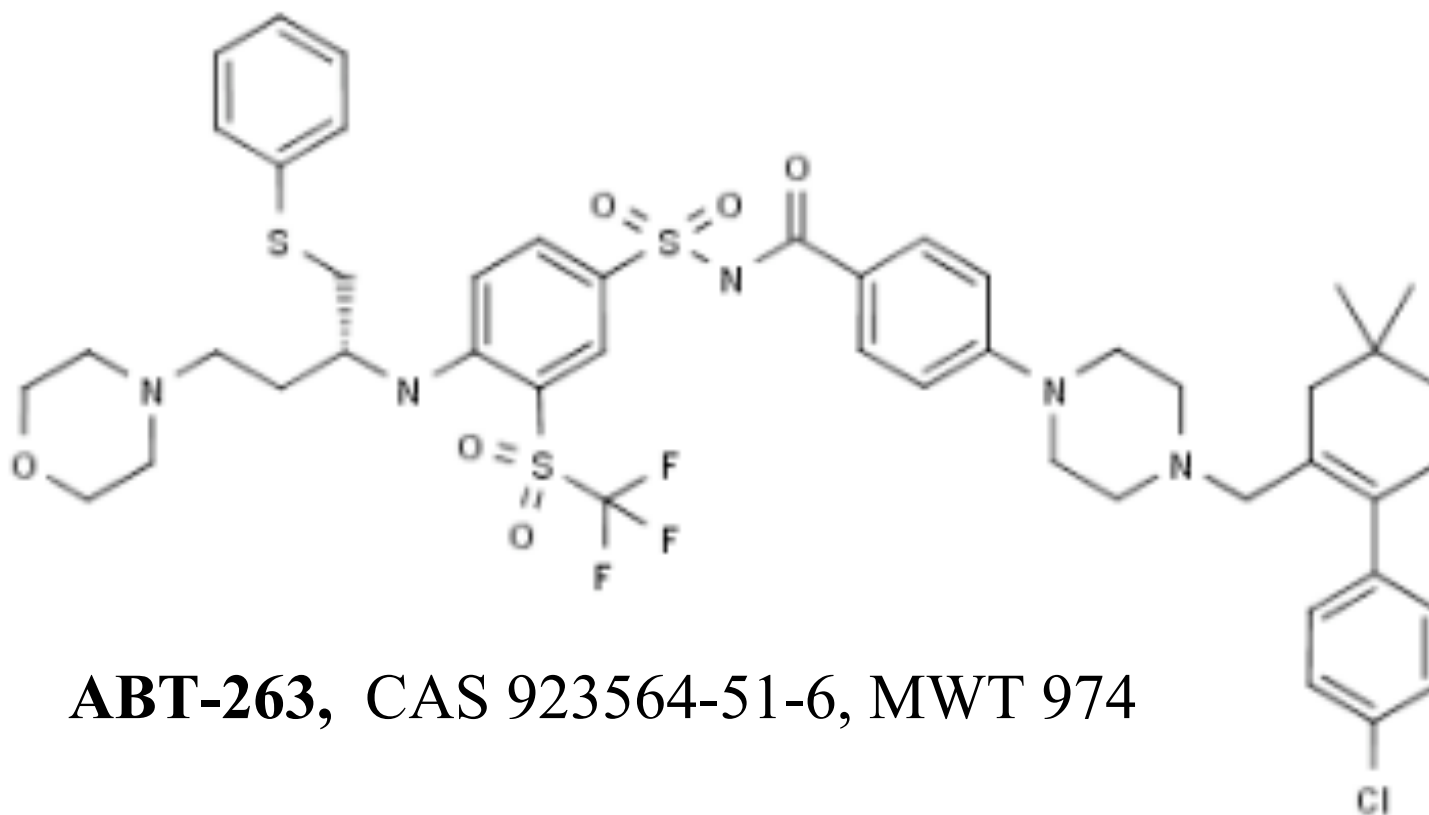
Lepourcelet, Maina; Chen, Ying-Nan P.; **France, Dennis S.**; Wang, Huisheng; Crews, Phillip; Petersen, Frank; Bruseo, Charles; Wood, Alexander W.; Shivdasani, Ramesh A. Small-molecule antagonists of the oncogenic Tcf/ β -catenin protein complex. *Cancer Cell* (2004), 5(1), 91-102.

Protein protein ligand ABT-737



Bruncko, Milan; Oost, Thorsten K.; Belli, Barbara A.; Ding, Hong; Joseph, Mary K.; Kunzer, Aaron; Martineau, Darlene; McClellan, William J.; Mitten, Michael; Ng, Shi-Chung; Nimmer, Paul M.; Oltersdorf, Tilman; Park, Cheol-Min; Petros, Andrew M.; Shoemaker, Alexander R.; Song, Xiaohong; Wang, Xilu; Wendt, Michael D.; Zhang, Haichao; Fesik, Stephen W.; Rosenberg, Saul H.; Elmore, Steven W. **Studies Leading to Potent, Dual Inhibitors of Bcl-2 and Bcl-xL.** *Journal of Medicinal Chemistry* (2007), 50(4), 641-662.

BCL-2 inhibitor compound in phase II



ABT-263, CAS 923564-51-6, MWT 974

Industry filters vary a lot

- Pfizer – lint 2001
 - likely the strictest filters in big pharma
- Abbott – Alarm NMR - 2005
 - possible screening problems due to thiol traps and Redox problems
 - a continuum rather than binary filter
- BMS -2006
- Glaxo -2001
 - compounds to avoid – very loose

Cysteine is the most nucleophilic AA

					He ²
B ⁵	C ⁶	N ⁷	O ⁸	F ⁹	Ne ¹⁰
Al ¹³	Si ¹⁴	P ¹⁵	S ¹⁶	Cl ¹⁷	Ar ¹⁸

Nucleophilicity increases as you descend a column

Nucleophilicity increases as you move to the left in a row

First principles suggest that thiol traps are likely one of the most troublesome chemistry screening problems against protein targets

Abbott Alarm NMR alerts

Table S2. Structural Descriptors Used To Predict Thiol Reactivity

Smile	F (%) ^a	TRI ^b	#tested	Smart
<chem>O=C1C=CC(=O)C=C1</chem>	100	0.30	16	<chem>O=C1C=CC(=O)C=C1</chem>
<chem>c1oc(=S)sc1</chem>	85	0.30	21	<chem>c1oc(=[O,S])sc1</chem>
<chem>O=C1OCCS1</chem>	85	0.30	20	<chem>O=[#6]1[o,O][#6]@[#6][s,S]1</chem>
<chem>SC#N</chem>	66	0.30	19	<chem>SC#N</chem>
<chem>[OH]c1ccc(O)cc1</chem>	60	0.30	35	<chem>[OH]a1aaa(O)aa1</chem>
<chem>O=C1CCC(=O)C=C1</chem>	60	0.30	10	<chem>O=C1CCC(=O)C=C1</chem>
<chem>O=C1C=CCC=C1Br</chem>	55	0.30	14	<chem>O=C1C=CCC=C1[F,Cl,Br,I]</chem>
<chem>C=CS</chem>	50	0.30	12	<chem>C=[C;R0]S</chem>
<chem>C=CCl</chem>	48	0.30	57	<chem>C=[C;Cl,Br,I]</chem>
<chem>c1cccc2nonc12</chem>	48	0.30	27	<chem>c1cccc2nonc12</chem>
<chem>Oc1ccc2nc(F)cnc2c1</chem>	47	0.30	20	<chem>[N,OH]c1ccc2nc([c,F])c[c,n]c2c1</chem>
<chem>[OH]c1ccc(N)cc1</chem>	44	0.30	60	<chem>[OH]a1aaa([n,N;R0])aa1</chem>
<chem>Nc1cccs1</chem>	44	0.30	30	<chem>[N;R0]a1caas1</chem>
<chem>Sc1ccccc1N</chem>	42	0.30	35	<chem>[s,S;R0;!\$(S(=O)(=O)N)]a1a([n,N;R0])aaaa1</chem>
<chem>C(=S)S</chem>	42	0.30	18	<chem>[#6]C(=S)S</chem>
<chem>SC1=NCCS1</chem>	38	0.30	40	<chem>SC1=NCC[N,S]1</chem>
<chem>n1ncnc2C(=O)NC(=O)Nc2c1</chem>	37	0.30	16	<chem>n1ncnc2c(=O)nc(=O)nc12</chem>
<chem>c1nsnc1</chem>	34	0.30	60	<chem>c1n[o,s]nc1</chem>
<chem>[SH]</chem>	34	0.30	37	<chem>[#6;!\$(C=C);!\$(CO);!\$(CN)][SH]</chem>
<chem>CBr</chem>	33	0.30	62	<chem>[C;!\$(C=C)][Br,I]</chem>
<chem>C1=CN=NC(=O)C1I</chem>	33	0.30	12	<chem>c1cnnc(=O)c1[Cl,Br,I]</chem>
<chem>NC=S</chem>	31	0.30	74	<chem>[n,N][c,C;R1]=S</chem>
<chem>C1CSCN1</chem>	30	0.30	81	<chem>C1CSCN1</chem>
<chem>Nc1nccs1</chem>	30	0.30	51	<chem>Nc1nccs1</chem>

Alerts detect from 100% to 3% of compounds causing thiol perturbation problems.

Up to the user to set an acceptable threshold

Huth J. R. et al. J. Am. Chem. Soc., 2005 127, 217-224

Alarm NMR fail on 740 FDA Drugs

CHEMISTRY	smartsfilter_matches	smiles	fail(#)	F (%)
ACEBUTOLOL	Oc1[a;R1][a;R1]a[a;R1][a;R1]1 ()	c1ccccc1O	46	10
Acetohexamide	S(=O)(=O)N ()	S(=O)(=O)N	44	8
Azithromycin	[o,O;R1][c,C]=O ()	O=C1CCCCO1	32	17
6alpha-Methylprednisolone	C=CC(=O)[c,C] ()	C=CC(=O)C	30	42
5-(N,N-dimethyl)-Amiloride	[N;!\$(N+);!\$(NC=[O,N])]c1[a;R1][a;R1]a[a;R1][a;R1]1 ()	c1ccccc1N	29	10
Acetophenazine	[c,C;!\$(C=O);!\$(C=N);!\$(C=S)][S;!\$(S=O)][c,C;!\$(C=O);!\$(C=N);!\$(C=S)] ()	CSC	26	23
(-)-Epinephrine	[OH]a1aaaaa1O ()	[OH]c1ccccc1O	21	22
Amlodipine	C=CC(=O)O[c,C] ()	C=CC(=O)OC	14	20
Ampicillin	C1CSCN1 ()	C1CSCN1	14	30
Almotriptan	csc ()	c1sccc1	14	19
AZTREONAM	Nc1nccs1 ()	Nc1nccs1	14	30
ANISINDIONE	c1ccccc1[C;R1](=O)[c,C] ()	c1ccc2C(=O)CCc2c1	13	23
ACETYLCYSTEINE	[#6;!\$(C=C);!\$(CO);!\$(CN)][SH] ()	[SH]	10	34

Adjusting Alarm NMR alerts

- FDA approved 740 drug data set
 - $F(\%) = 100$ is 100% of the time a thiol trap
 - $F(\%) = 30$ is 30% of the time a thiol trap
- Most FDA failures are where $F(\%) < 30$
- Suggests using alerts where $F(\%) > 30$
 - ie. focus mostly on the really bad thiol traps
- Filter out when a functionality fails both a thiol trap and a compound quality filter

Screening starting point - LOPAC¹²⁸⁰ library of pharmacological actives

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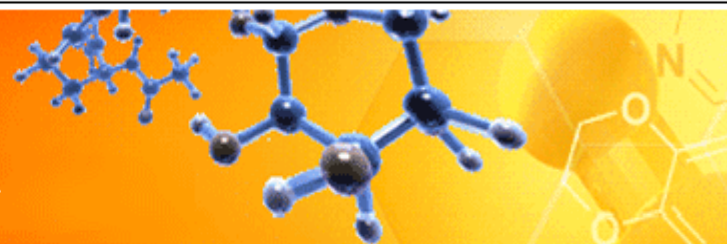
 [Chemistry](#) > [Drug Discovery](#) > [Validation Libraries](#) > LOPAC¹²⁸⁰ Navigator

Validation Libraries

LOPAC¹²⁸⁰ Navigator

Library of Pharmacologically Active Compounds

WELCOME to
LOPAC¹²⁸⁰
NAVIGATOR



Sigma-Aldrich invites you to use this interactive tool to easily browse through LOPAC^{1280™}, a collection of 1,280 compounds.

Thiol reactivity is very prevalent

- Desalt Lopac1280 in ACS/Labs Chemfolder
- Export cleaned up compounds as an sdf file
- Run Abbott Alarm NMR and Pfizer lint alerts
- Alarm NMR Pfizer lint Numbers

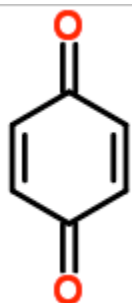
Fail Fail 363 (28%)

Fail Pass 356 (28%)

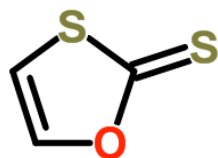
Pass Fail 202 (16%)

Pass Pass 359 (28%)

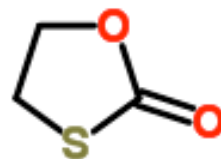
Worst Alarm NMR moieties



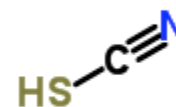
100%



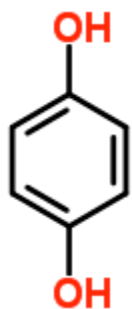
85%



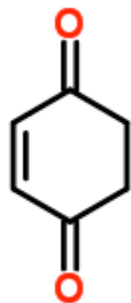
85%



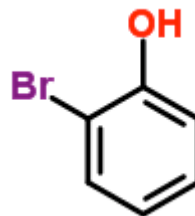
66%



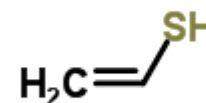
60%



60%



55%



50%

Drug Repurposing Observations

- New uses for an old drug:
 - success rate is 10 – 90%
 - 70 – 90% is original mechanism
- Smaller drugs are better
 - properties change throughout clinical
 - MWT 347 mean for FDA approved drugs
 - merit in “back to the future” approach

Drug repurposing examples

- Nelfinavir for cancer
- Tamoxifen for bipolar disorder
- Gleevec for rheumatoid arthritis
- Pentylentetrazole for downs syndrome
- Minocycline for retinopathy
- Thioridazine for tuberculosis
- Astemizole for malaria
- Lipitor for alzheimers
- Lipitor for influenza mortality
- Metformin for cancer

Phenotypic Screens and Mechanism

- FDA doesn't require mechanism.
- Drug company attitude change
 - eg. Sanofi-Aventis, Eli Lilly
- Phenotypic screen gives an active but without mechanism.
- Progress on deciphering mechanism
 - antibacterials and antivirals
- Phenotypic screen for target validation

Phenotypic screening leverage

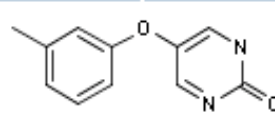
- Phenotypic screening
 - enhanced target opportunity space
- Melior runs pan therapeutic in-vivo screens
 - finds activity in type II diabetes model
 - finds an in-vivo active in a clinically tested drug
 - literature unprecedented mechanism
- Wildly lucky or predictable in drug repositioning?
 - 97 mechanisms for type II diabetes in Prous' Integrity

MLR-1023 aka Tolimidone

Records Retrieved 1 in Drugs & Biologics **Options** ▾

Drugs & Biologics Search Results 1

Query > **Drug Name** = MLR-1023

Entry Number	329565 UPDATES	Chemical Structure	STRUCTURE FEATURES
CAS Registry No.	041964-07-2	 <p>Tolimidone</p>	
Molecular Formula	C11H10N2O2		
Molecular Weight	202.2094		
Highest Phase	IND Filed		
Under Active Development			
Chemical Name/Description			
5-(3-Methylphenoxy)pyrimidin-2(1H)-one			
Code Name	Generic Name	Brand Name	
CP-26154 MLR-1023	Tolimidone		
Therapeutic Group	Cellular / Molecular Mechanism	Biological / Chemical Group	
Antiulcer Drugs Type 2 Diabetes, Agents for			
Organization			
Melior Discovery Pfizer (Originator)			

Melior MLR-1023

- Antiulcer compound phase 3 from 1970's Pfizer. New activity from phenotypic in-vivo mouse screens
- IND filed by Melior Discovery for type 2 diabetes/metabolic syndrome. Lyn kinase activator with EC-50 63 nm. MWT 202, LE 0.48 kcal/heavy atom
- How many other unrecognized kinase activators are there?

Why does repurposing work?

- Negative viewpoint
 - 85-90% novel targets fail
 - Network bypasses the block
 - 10% predictivity in clinical
 - Unexpected clinical effects
 - Pleiotropic effects
 - Useful activity seen late
 - Too late to be clinically optimized
- Positive viewpoint
 - Phenotypic screening
 - In-vivo screening
 - Pathway screening
 - Screen the 1-2% that become early clinical drugs
 - Screen known drugs
 - 30 – 90% success rate
 - An active drug almost never has just a single activity

Currently using **Lipinski Group** data and **6 shared data sets** ⓘ[Choose data sets ...](#)[Back to Dashboard](#)**CAS 957217-65-1** PUBLIC MOLECULE

Available in 3 data sets. Now viewing:

TB MIC Prathipati NIAID - 37532

Overview

Batches 2

Plates 1

Protocols 3

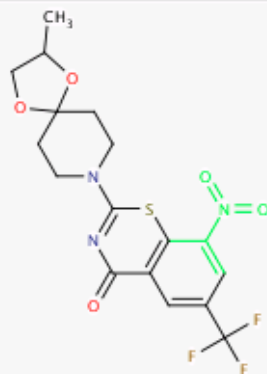
Associated Files 2

Alerts 2

2 Alerts

Structure Match Preview

Alert

⚠ **Abbott Alarm NMR failed**

- CSC
- Nc1cccc2aaaaa12

⚠ **Pfizer Lint failed**

- O~N(=O)-c(:)* (aromatic NO2)

Conclusion

- We need to “share” information
- We need to “mine” existing drugs
- We need mechanisms to enhance biology – chemistry “collaboration”
- We need diversity in our screening