

Understanding Compound Quality

Focus on Molecular Property Design

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***A high level view
Oral small molecules***

Success rates: Preclinical-Phase III **4.3%**; Phase II **23%**

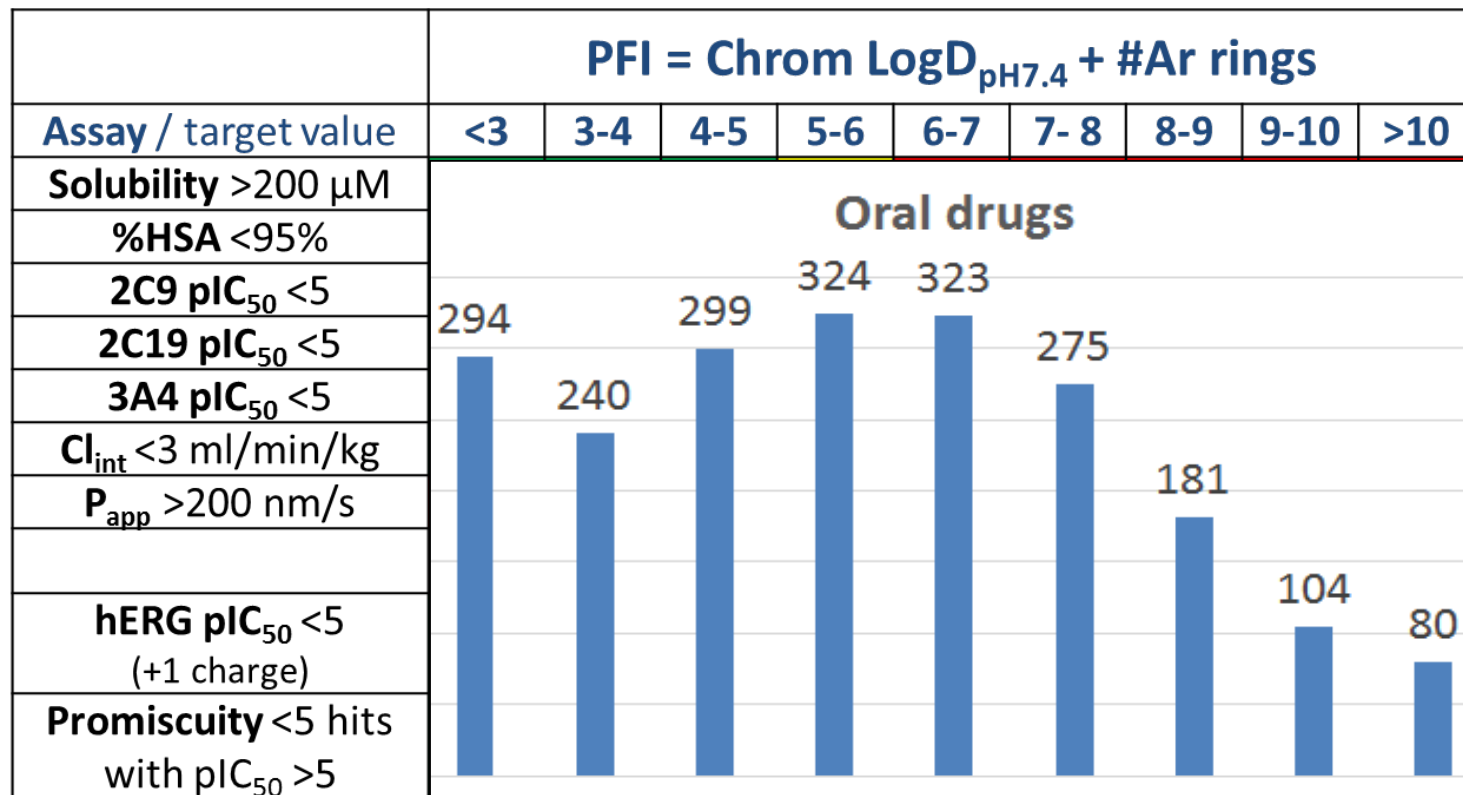
*Evidence for progression of **unoptimised compounds***

- **Pfizer: '4 Pillars' for phase II success** (*44 phase II projects, 2005-9*)
 - **Exposure at target; Binding to target; Pharmacological response; Target linked clinically to disease modification**
 - Low confidence in *exposure* in 18/34 non-progressing molecules:
“cannot conclude mechanism tested adequately in 43% of cases”
- **AstraZeneca: '5Rs'** (*>114 preclinical to phase II projects, 2005-10*)
 - **'Right': Target & Tissue (4Ps); Safety; Patient; Commercial potential**
 - 29% Clinical efficacy failures **“dose limited by compound characteristics or tissue exposure not established”**
 - **Decision making process:** eg, 38% projects advanced to clinic had *low confidence in safety* & 78% of these eventually failed due to toxicity
- **GSK: solubility-limited candidates** – *BCS II/DCS class IIb*
 - **Add 2 years to development:** “lack of efficacy owing to lack of exposure”
- **FDA submissions** (*302 NMEs, 2000-12; 151 (50%) unsuccessful 1st time*)
 - 29% Unsuccessful 1st submissions had **dose or clinical end point issues**

Success rates: Thomson Reuters, 2006-10; **4 Pillars:** Morgan et al, *Drug Discovery Today* 2012, **17**, 419; Bunnage, et al *Nat. Chem. Biol.* 2013, **9**, 195; **5Rs:** Cook et al, *Nat. Revs. Drug Disc.* 2014, **13**, 419; **Solubility:** Hann & Keserú, *Nat. Rev. Drug Disc.* 2012, **11**, 355; **FDA:** Sacks et al, *JAMA* 2014, **311**, 378; **Pharma's problems:** Scannell et al, *Nat. Rev. Drug Discov.* 2012, **11**, 191

A Significant Body of Evidence links Physical Properties to *Probability* of ADMET Risk

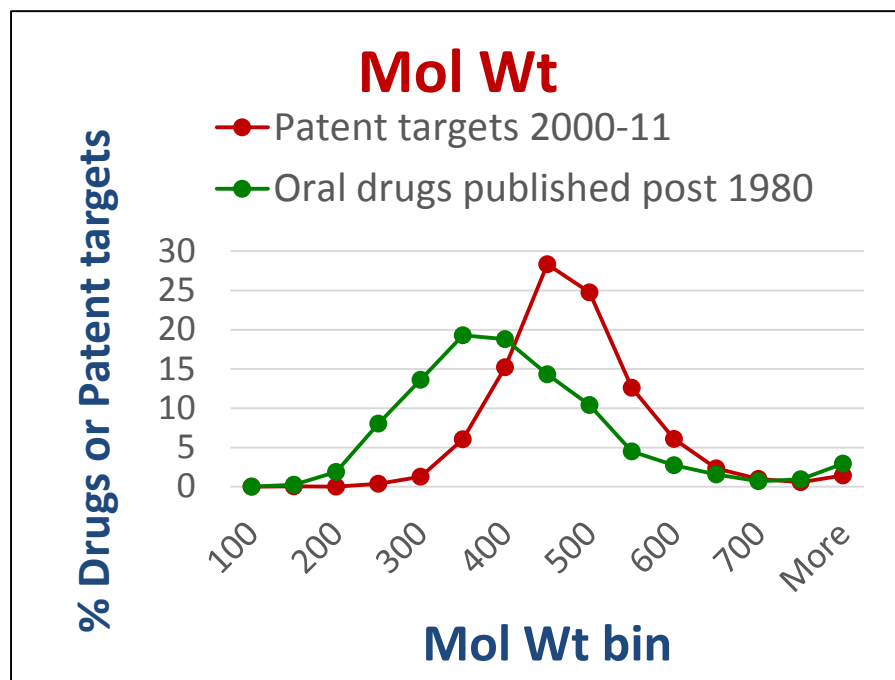
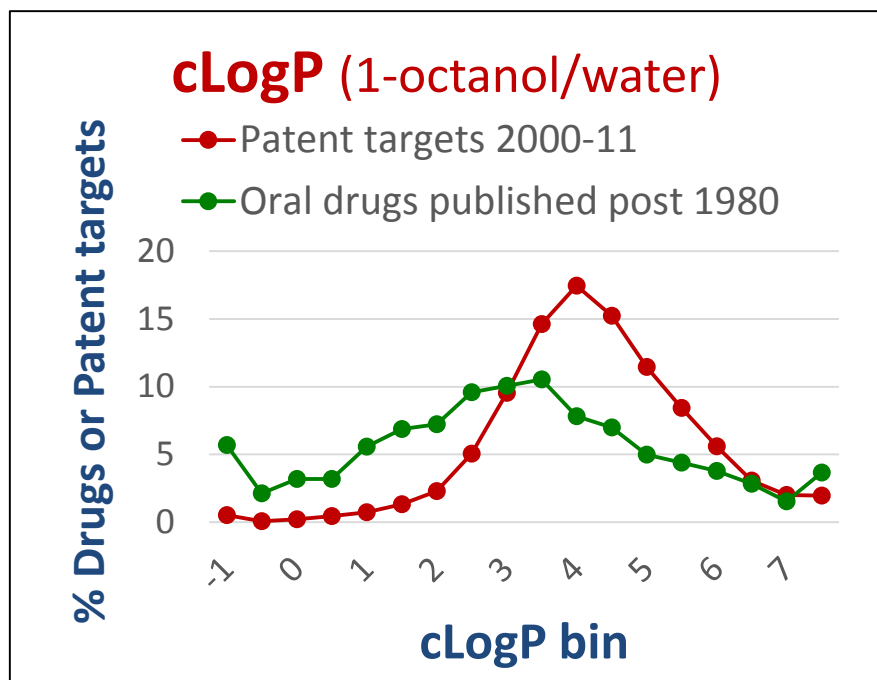
Key properties: lipophilicity + ionisation. *Property forecast index (PFI)*



≥67%
34-66%
<33%
 % chance of achieving target in particular bin

PFI: Young et al, *Drug Disc. Today* 2011, **16**, 822; **Physical property reviews:** Meanwell, *Chem. Res. Toxicol.* 2011, **24**, 1420; Young, *Top Med. Chem.* 2015, **9**, 1; Gleeson et al, in *The Handbook of Medicinal Chemistry: Principles and Practice*, eds A.M. Davis and S. Ward, RSC, 2015, p1-31; Hann & Keserú, *Nat. Rev. Drug Disc.* 2012, **11**, 355; Gleeson et al. *Nat. Rev. Drug Disc.* 2011, **10**, 197; **Lipophilicity:** Waring, *Exp. Op. Drug Disc.* 2010, **5**, 235; **Ionisation:** Charifson & Walters, *J. Med. Chem.* 2014, **57**, 9701; **Ar rings review:** Ritchie & Macdonald, *J. Med. Chem.*, 2014, **57**, 7206; **Critique - statistics:** Kenny & Montanari, *J. Comp.-Aid. Mol. Des.* 2013, **27**, 1; **Critique - toxicity data:** Muthas et al, *MedChemCommun.* 2013, **4**, 1058

Properties of Patented Compounds & Oral Drugs



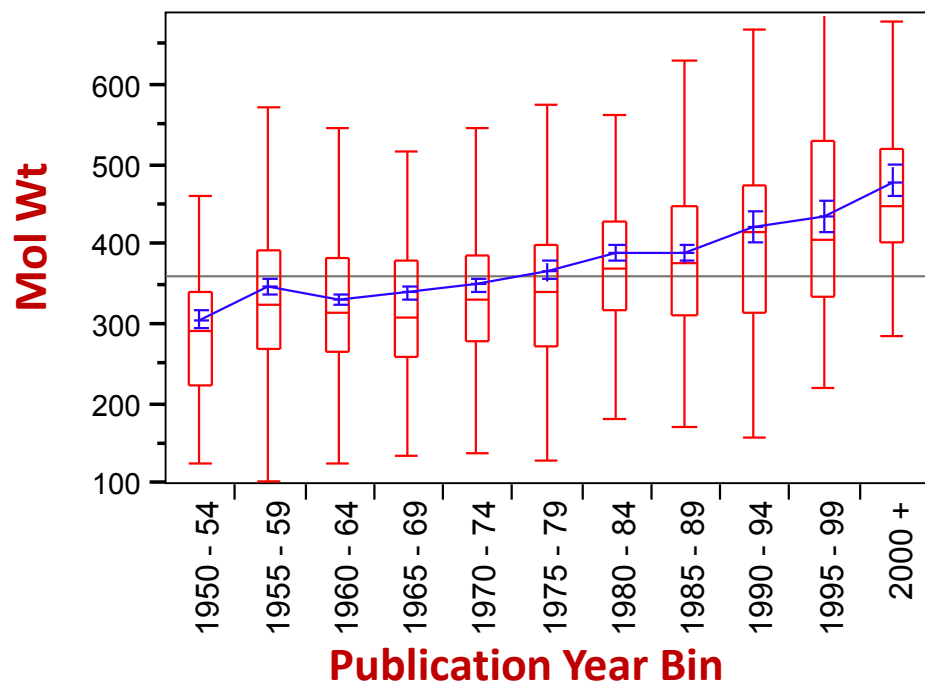
- ‘Inflated’ patented compounds are likely to possess increased ADMET risks vs recently marketed drugs → **pipeline attrition?**
- Will the **probability of success in a portfolio** of drug candidates increase as its balance of biological and physicochemical properties more closely resembles that of successful marketed drugs?
- What other viable strategies exist for medicinal chemists to improve productivity?
- **Compound quality is a medicinal accountability.** Fixed at the point of design, controllable in optimisation, **must not be the root cause of clinical attrition**

Drug data: Leeson et al, *Med. Chem. Comm.* 2011, **2**, 91, updated to 2014

Patent data: Leeson & St-Gallay, *Nature Revs. Drug Disc.* 2011, **10**, 749

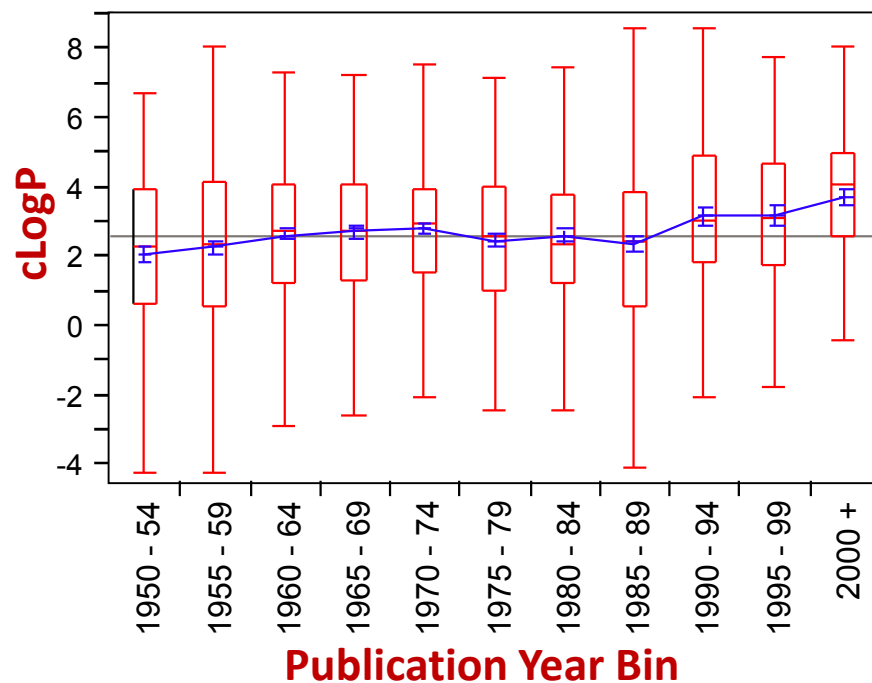
Oral 'Druglike' Properties: Changes over Time

Median	291	324	313	308	331	339	371	376	416	409	451
n	144	223	302	236	217	164	141	107	78	53	85



Increasing significantly ~10-20 years

2.30	2.34	2.73	2.74	2.96	2.59	2.37	2.46	3.01	3.15	4.07
144	223	302	236	217	164	141	107	78	53	85



No change until 2000 +

- **Least change:** cLogP, HBD, %PSA, Fsp3 & chiral atoms
- **Most change:** Mol Wt, HBA, RotB, PSA & Ar; *all increasing*

Hypothesis: drug properties changing least are more important

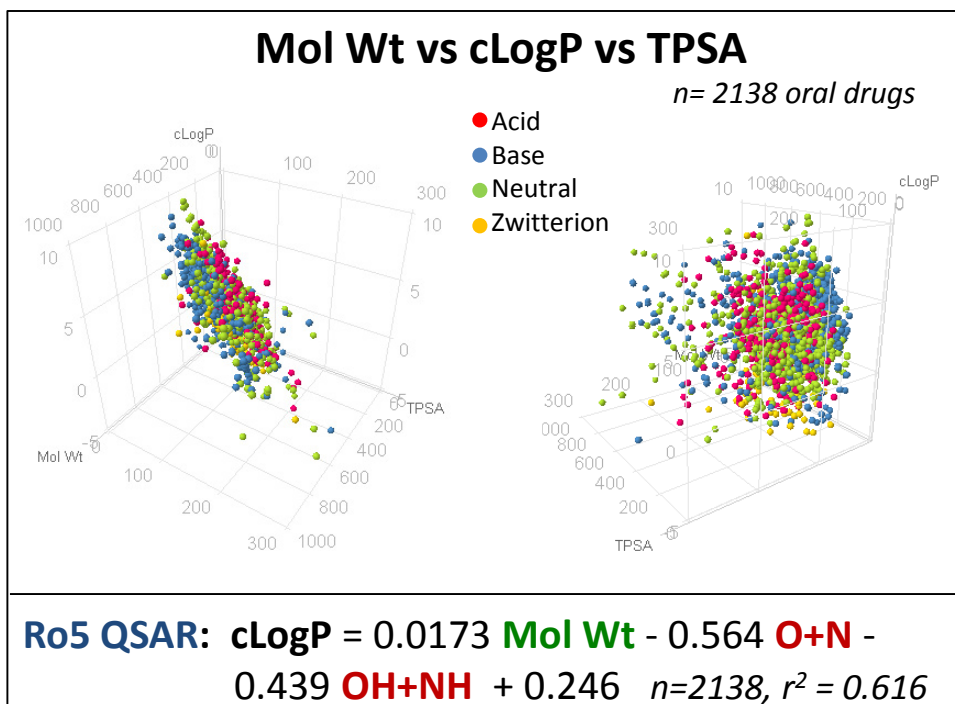
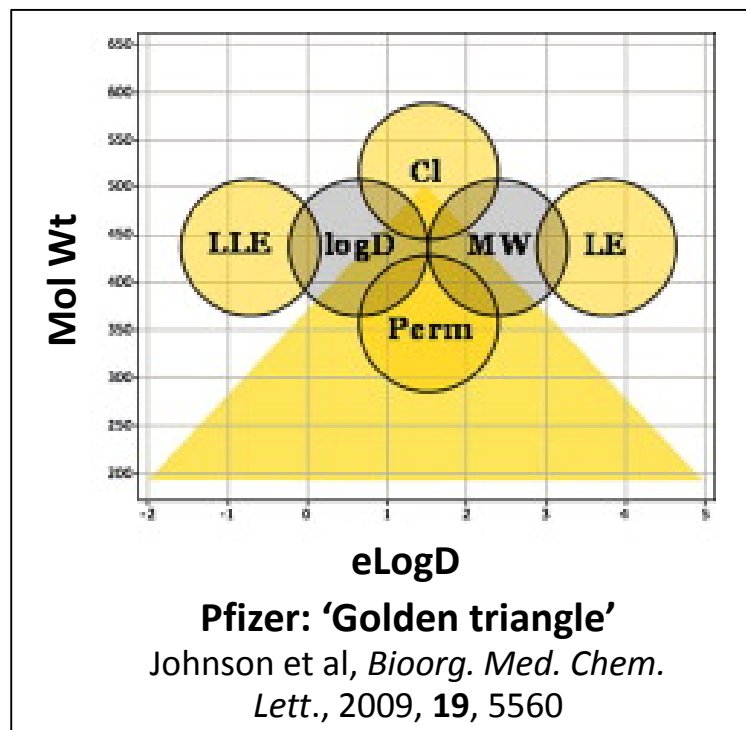
Does Size Matter?

neutral molecules	MWT < 400 and clogP < 4	MWT > 400 and/or clogP > 4
solubility	average	lower
permeability*	higher	average/higher
bioavailability	average	lower
volume of Dist.**	average	average
plasma protein binding	average	higher
CNS penetration***	higher/average	average/lower
brain tissue binding	lower	higher
P-gp efflux	average	higher/average
in-vivo clearance	average	average
hERG Inhibition	lower	lower
P450 inhibition****	lower 2C9, 2C19, 2D6 & 3A4 inhibition	higher 2C9, 2C19 & 3A4 inhibition
P450 inhibition****	higher 1A2 inhibition	lower 1A2 inhibition
P450 inhibition****		average 2D6 inhibition

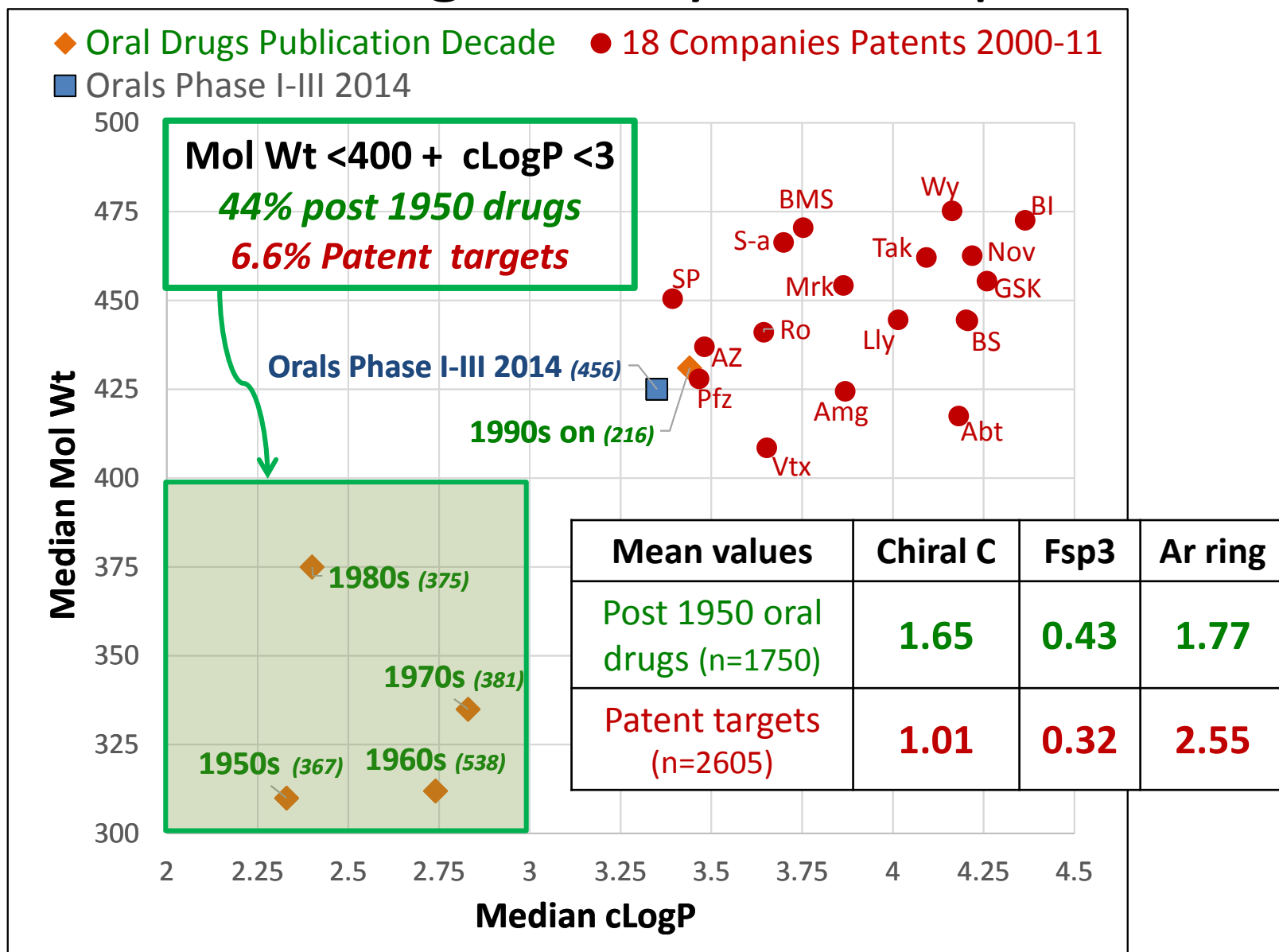
GSK: ADME '4/400' rule
Gleeson, *J. Med. Chem.* 2008, **51**, 817

Mol Wt	AZLogD
<300	>0.5
300-350	>1.1
350-400	>1.7
400-450	>3.1
450-500	>3.4
>500	>4.5

AZ: Mol Wt & LogD dependent permeability
Waring, *Bioorg. Med. Chem. Lett.*, 2009, **19**, 2844



Inflation of 'Druglike' Physical Properties



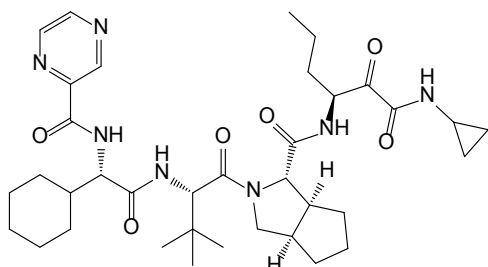
Drug data: Leeson et al, *Med. Chem. Comm.* 2011, **2**, 91, oral drugs updated to 2014; **Patent targets** 2000-11 from 18 companies: Leeson & St-Gallay, *NRDD* 2011, **10**, 749; **Phase I-III orals:** <http://www.citeline.com/>

Disease Risk/Benefit & Property Inflation

36% 2012-14 FDA approvals are orphan drugs

post-1990 Orals (n=216)	Median cLogP	Median Mol Wt	≥2 Ro5 unmet
Kinase, HIV prot., HCV (n=45)	4.64	556	40% (18)
Others (n=171)	3.07	420	12% (20)
			Pre-90: 6.5%

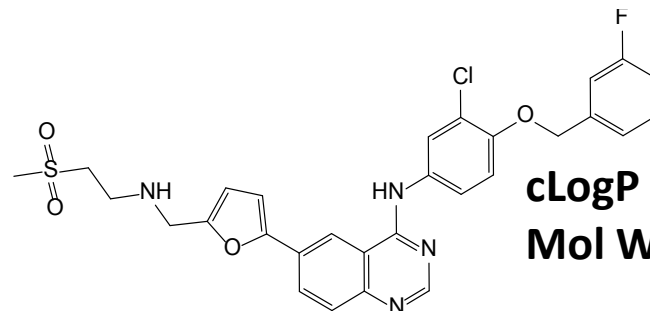
Telaprevir: HCV NS3 protease



cLogP 5.4
Mol Wt 680

Dose 750mg *tid*, high fat food; sol. 4.7 µg/ml, 'less than marble;' SDD formulation; **Black Box**: serious skin reactions; *efficacious, superceded*

Lapatinib: EGFR & ErbB2 kinases



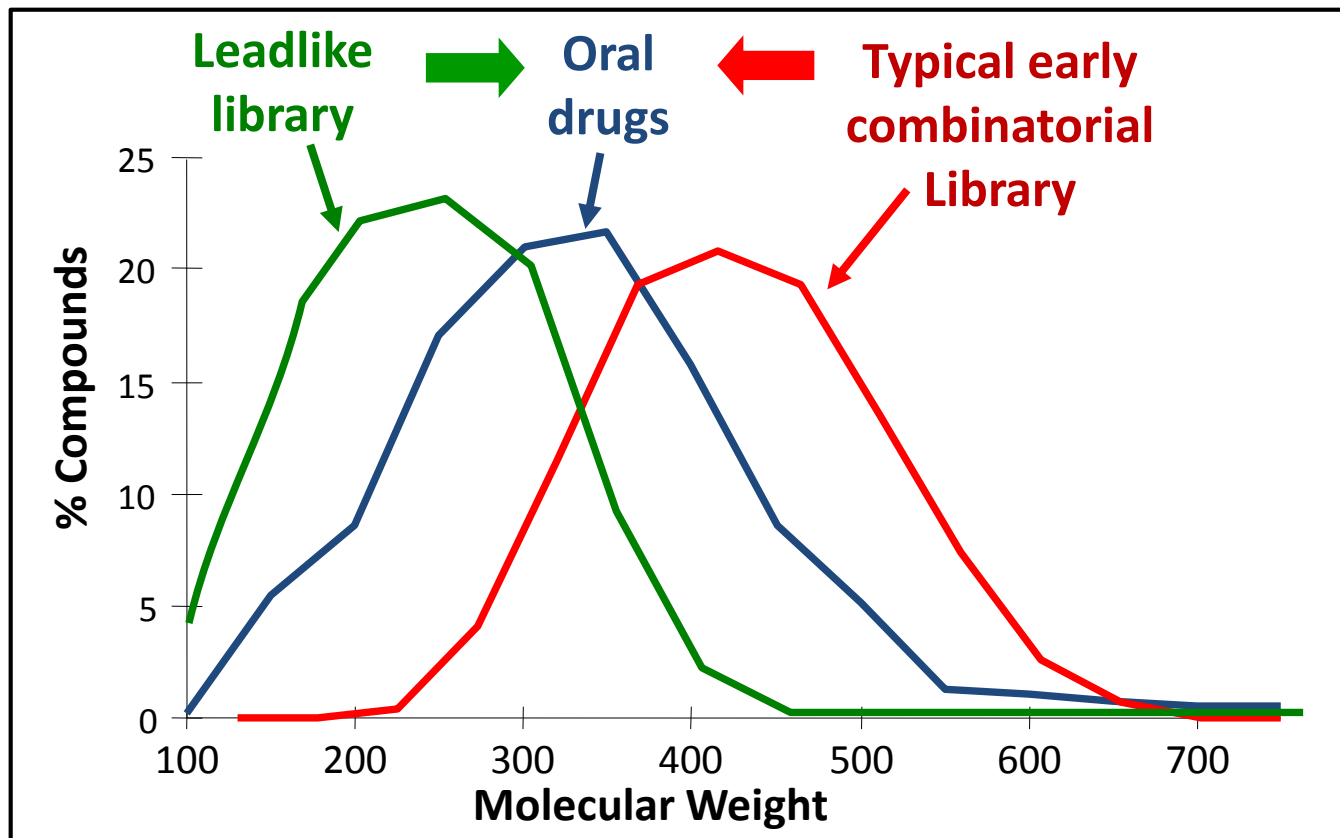
cLogP 5.8
Mol Wt 581

Dose 1500mg *uid*, 1hr before or after meal; sol. 7 µg/ml; hERG inhibitor; **Black Box**: hepatotoxic; *slow off-rate; standard treatment for breast cancer*

Medical need & efficacy can overcome risk & dosing inconvenience

Telaprevir: Kwong et al, *Nat. Biotech.* 2011, **29**, 993; **Lapatinib:** Lackey & Cockerell in *Kinase Inhibitor Drugs*, Wiley, 2009, p41; **Cancer drugs & food interaction:** Weitschies, *Clin. Pharm. & Therapeutics* 2013, **94**, 441

Physical Properties Tend to Increase in Optimisation: *the 'Leadlike' Hypothesis*

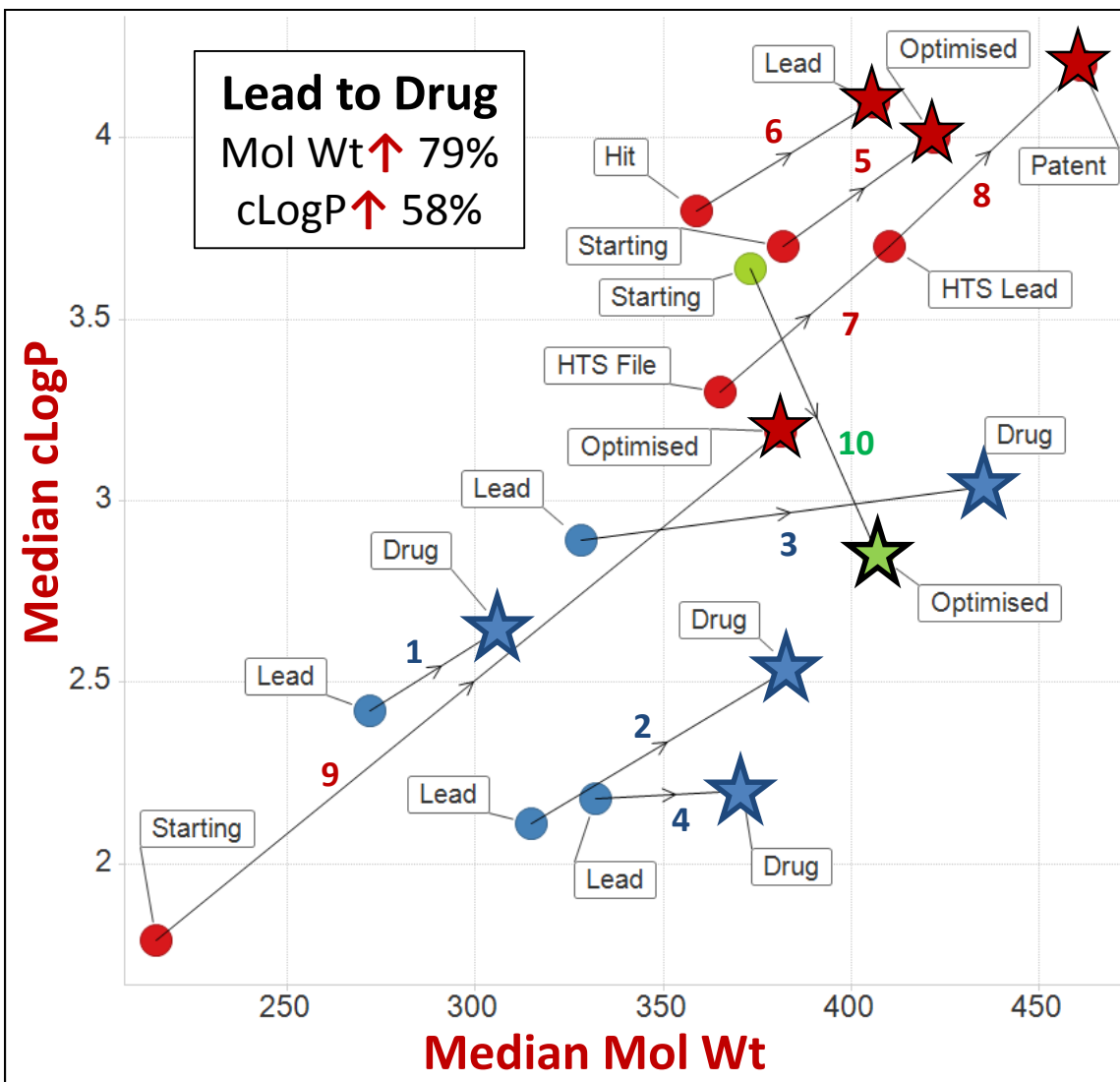


'Leadlike' lead: Affinity >0.1 μ M; Mol Wt 100-350; cLogP 1-3

Leadlikeness: Teague, Davis, Leeson & Oprea, *Angew. Chem. Int. Ed.* 1999, **38**, 3743; Oprea et al, *J. Chem. Inf. Comput. Sci.* 2001, **41**, 1308; Hann et al, *J. Chem. Inf. Comput. Sci.* 2001, **41**, 856; **Synthetic challenges:** Doveston et al., *Org. Biomol. Chem.* 2015, **13**, 859

Property Inflation in Optimisation

Leadlike hypothesis: Teague et al, *Angew. Chem. Int. Ed.* 1999, **38**, 3743

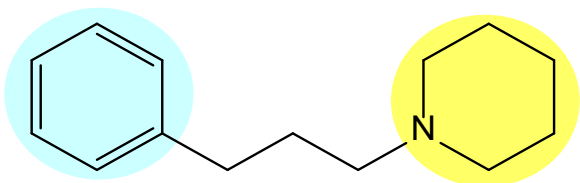


	<i>n</i>
1. Lead to drug - historical	469
2. Lead to drug - historical	62
3. Lead to drug, post 1990	60
4. 1 st Drug to follow-on	74
5. Lit 2000s optimisation	1680
6. Lit 2000s HTS, hit-to-lead	335
7,8. HTS file/lead/patents 4 companies	
9. Fragment optimisation	145
10. Lit 2000s LLE opt'n LLE = $p(\text{Activity}) - \text{LogP}/D$	57

1. Hann, *J.Chem. Inf. Comput. Sci.* 2001, **41**, 856; 2. Oprea, *J. Chem. Inf. Comput. Sci.* 2001, **41**, 1308; 3. Perola, *J. Med. Chem.* 2010, **53**, 2986;
4. Giordanetto, *DDT* 2011, **16**, 722; 5. Morphy, *J. Med. Chem.* 2006, **49**, 2969; 6. Keseru, *NRDD* 2009, **8**, 203; 7. Macarron, *NRDD* 2011, **10**, 188; 8. Leeson, *NRDD* 2011, **10**, 749; 9. Ferenczy *J. Med. Chem.* 2013, **56**, 2478; 10. Hopkins, *NRDD*, 2014, **13**, 105

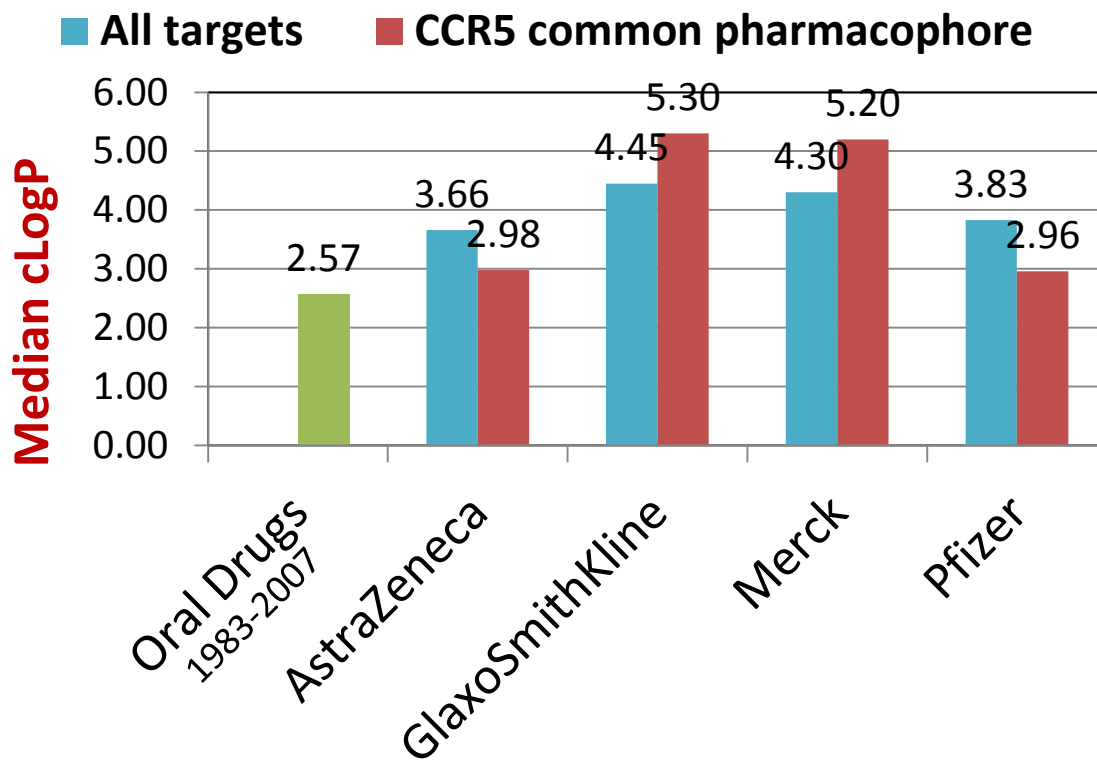
Divergent Company Design Practices

eg CCR5 Antagonists with a Common Pharmacophore



**Phenylpropyl-
piperidine**

CCR5 antagonist
pharmacophore pursued
by all 4 Companies:
AstraZeneca & Pfizer
reached the clinic



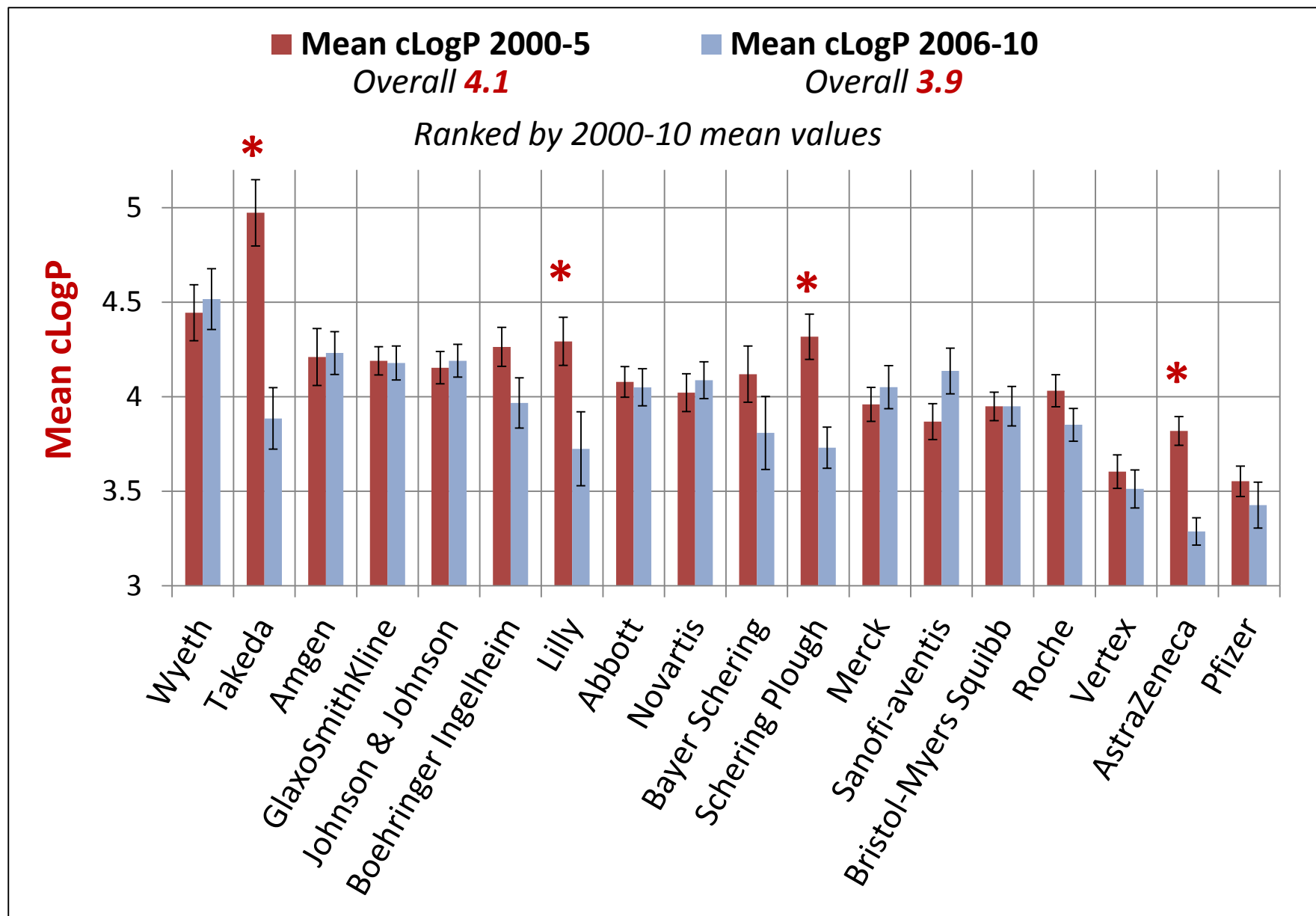
WO Patents 2001-6. Source: GVK BIO db

- **Company differences: comparable to target class differences**
- **Companies' design strategies: powerful impact of culture, history, experience, expertise; slow to change**

Leeson & Springthorpe, *Nat. Rev. Drug Disc.* 2007, **6**, 881;

18 Company target-unbiased 2000-11 analysis: Leeson & St-Gallay, *Nat. Rev. Drug Disc.* 2011, **10**, 749

Some Companies are Changing, Many are Not



Some Causes of Molecular Inflation

- **Increasing potency as the primary goal**
 - Often leads to increased cLogP & Mol Wt in a series
 - Medicinal ‘obsession’?
- **Misinterpreting the ‘rule of 5’**
 - Ro5 uses 90 percentile values
 - cLogP 4.5-5 + Mol Wt 450-500 is Ro5 compliant, *but occurs in only 1% of oral drugs*
- **Hit selection**
 - Hit validation / selection is a critical step
 - Mean literature HTS hit: pAct 6.1 & **cLogP 3.7**
- **Synthetic feasibility**
 - Parallel chemistry mostly adds Mol Wt
 - Complex molecules & ‘difficult’ chemistry sometimes avoided?

Potency: Hann, *MedChemComm*. 2011, **2**, 349; **HTS hit selection:** Keserú & Makara, *Nat. Rev. Drug Disc.* 2009, **8**, 203; Dahlin & Walters, *Future Med. Chem.* 2014, **6**, 1265; **Synthetic pragmatism:** Keserú et al, *Chem. Soc. Rev.*, 2014, **43**, 5387; **PPI:** Kuenemann et al, *J. Chem. Inf. Model.* 2014, **54**, 3067; **Company practice:** Leeson & St-Gallay, *Nat. Rev. Drug Disc.* 2011, **10**, 749; **Chemist behaviour:** Kutchukian, et al, *PLoS ONE*, 2012, **7**, e48476; **MPO:** Wager et al, *J. Med. Chem.* 2013, **56**, 9771

Some Causes of Molecular Inflation, contd.

- **Increase in less 'druggable' targets**
 - 'Low-hanging fruit' at the centre of drug-like space has been picked?
 - New, tougher targets – eg protein-protein interactions with large hydrophobic interfaces?
- **Disease risk/benefit**
 - Increased acceptance of safety risk & dosing inconvenience
- **Divergent design practices**
 - Search for new intellectual property; most targets are pursued by >1 organisation
 - Multiparameter optimisation used? Influence on medicinal chemists' decisions from **computational & ADMET** scientists?
- **It does not matter**
 - 'There are already highly lipophilic drugs on the market'

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Ligand Efficiency (LE) & Lipophilic LE (LLE or LipE)

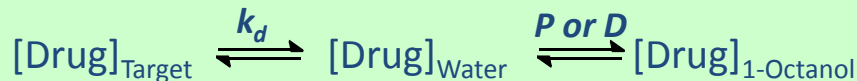
'Bang for your buck' guidelines $p(\text{Activity}) = pK_d, pK_i, pIC_{50}, pEC_{50}$

$$\text{LE} = p(\text{Activity}) * 1.37 / \text{HA}$$

Units: kcal/mol/heavy atom

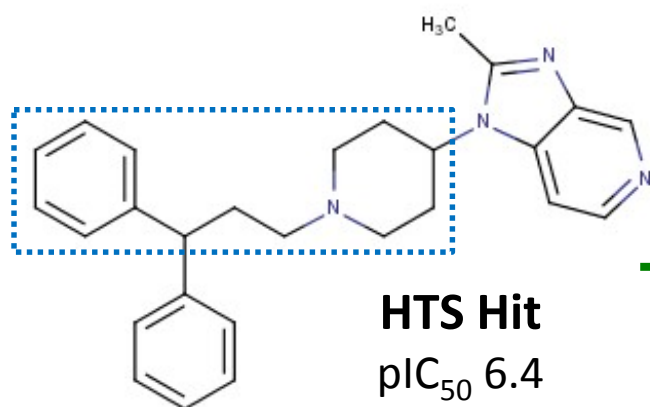
Mean oral drug LE = 0.45

$$\text{LLE} = p(\text{Activity}) - \text{LogP}/D$$

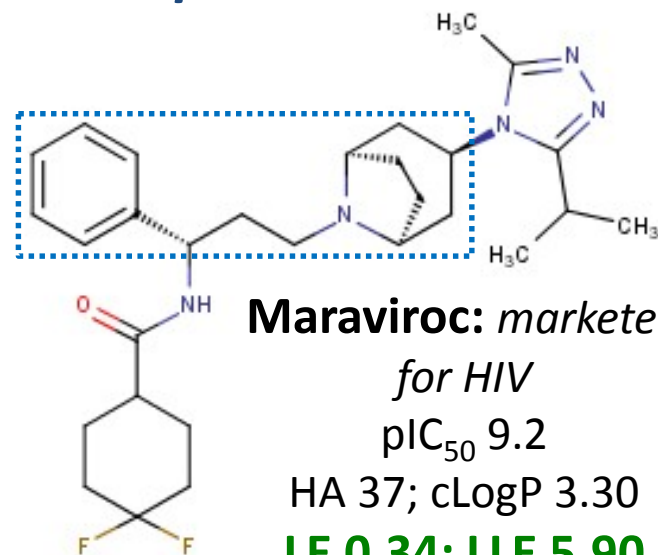
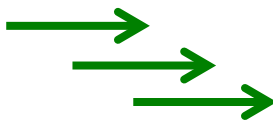


Mean oral drug LLE (cLogP) = 4.4

Pfizer CCR5 Receptor Antagonist Optimisation



Δ LLE 4.1



Employed LE; issues addressed: antiviral activity, P450 & hERG inhibition, permeability

Wood & Armour, *Prog. Med. Chem.* 2005, **43**, 239; Price et al, *Bioorg. Med Chem Lett* 2006, **16**, 4633; Armour et al, *ChemMedChem* 2006, **1**, 706

Drug data (n=261) calcd. from: Gleeson et al, *Nat. Revs. Drug Disc.* 2011, **10**, 197; **LE:** Hopkins et al, *Drug Disc. Today* 2004 **9**, 430; **LLE:** Leeson & Springthorpe, *Nat. Rev. Drug Disc.* 2007, **6**, 881; **Review:** Hopkins et al, *Nat. Rev. Drug Disc.*, 2014, **13**, 105; **Debate:** Shultz, *ACS Med. Chem. Lett.* 2014, **5**, 2; Murray et al, *ACS Med. Chem. Lett.* 2014, **5**, 616; Kenny et al, *J. Comput. Aided Mol. Des* 2014, **28**, 699

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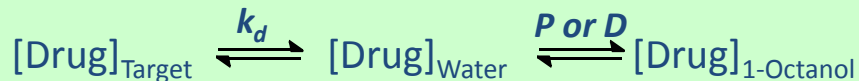
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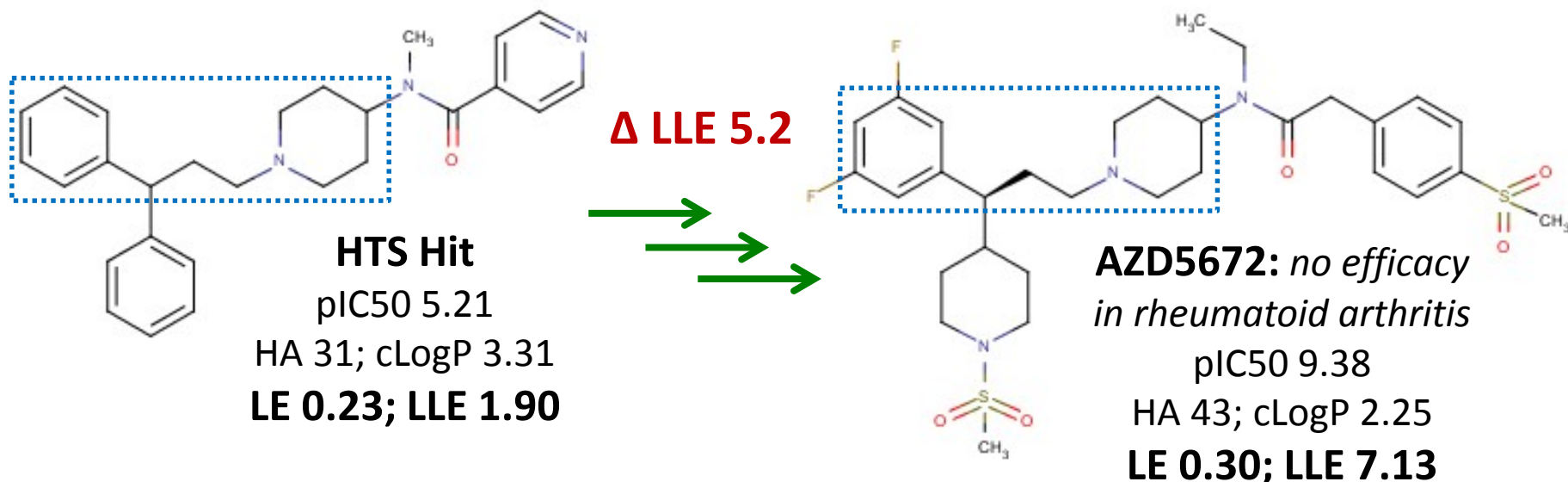
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AstraZeneca CCR5 Receptor Antagonist Optimisation



Issues addressed: affinity, hERG inhibition, absorption

Cumming et al, *Bioorg. Med. Chem. Lett.* 2012, **22**, 1655; 2005, **15**, 5012; 2006, **16**, 3533

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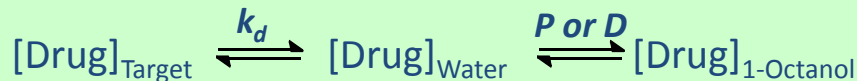
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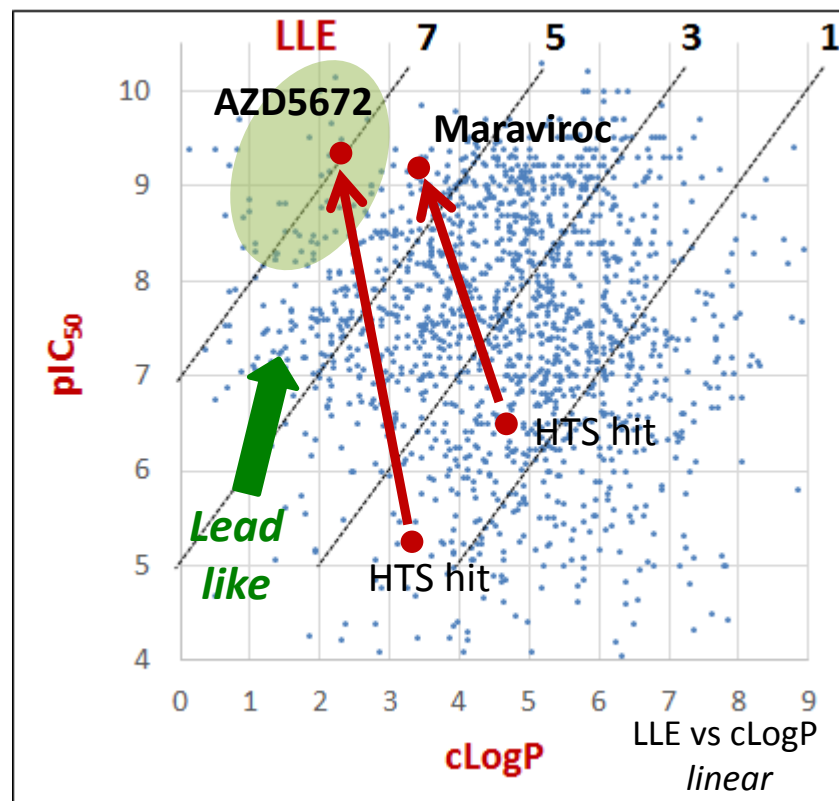
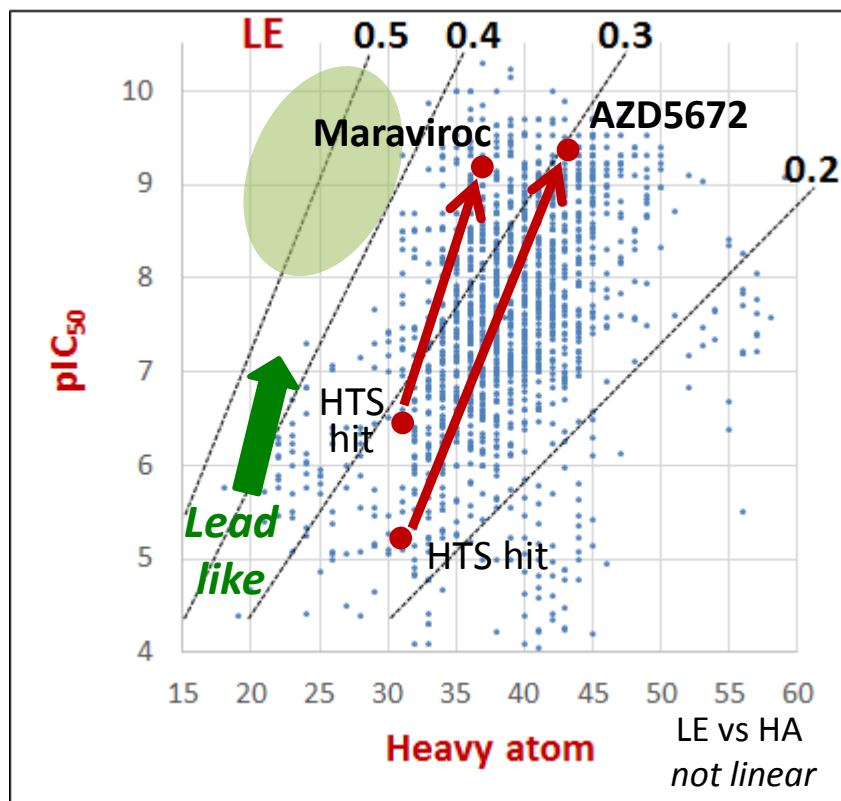
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CCR5 Receptor Ligands: pIC_{50} values ex ChEMBL (n=1513)



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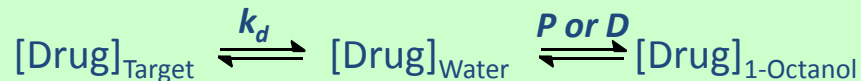
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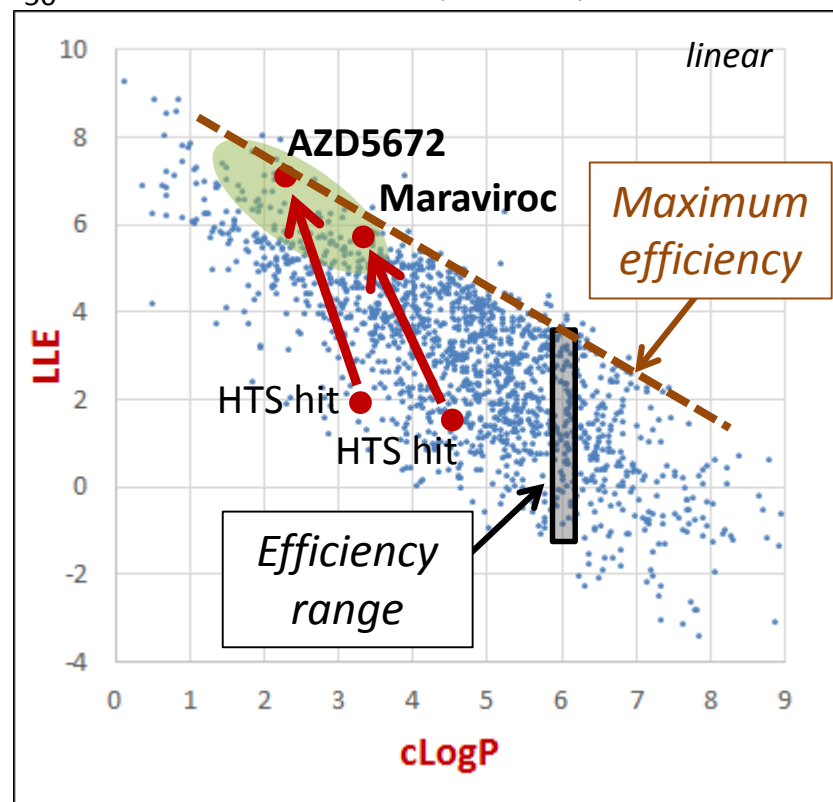
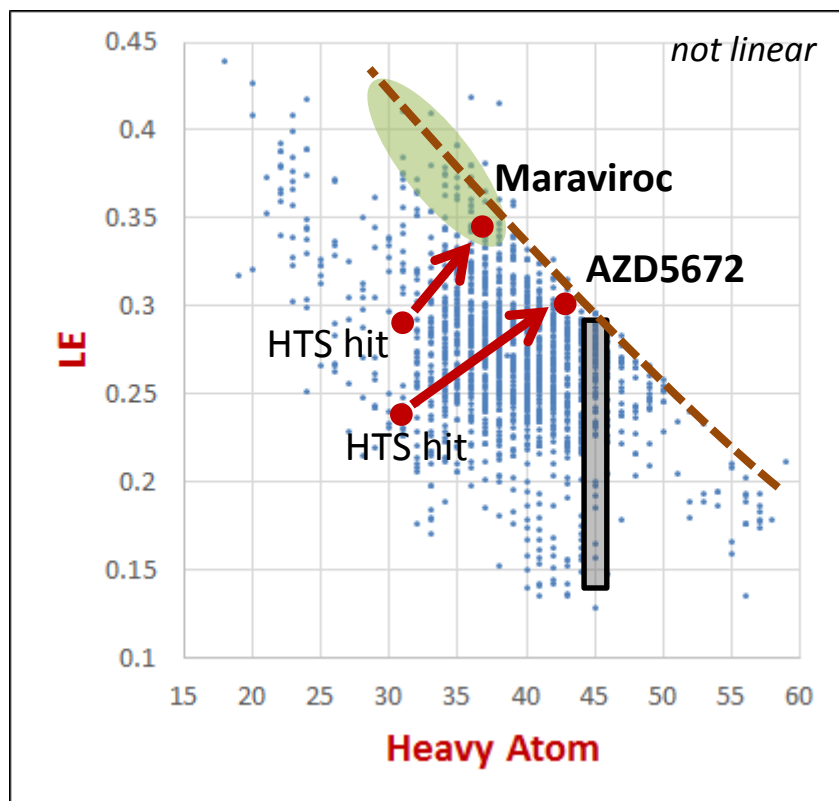
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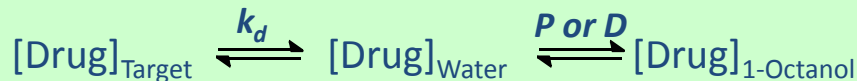
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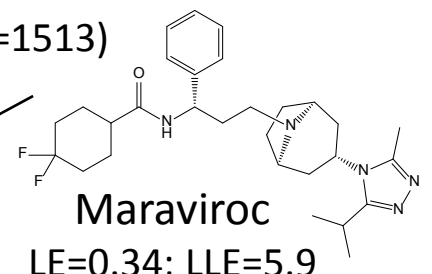
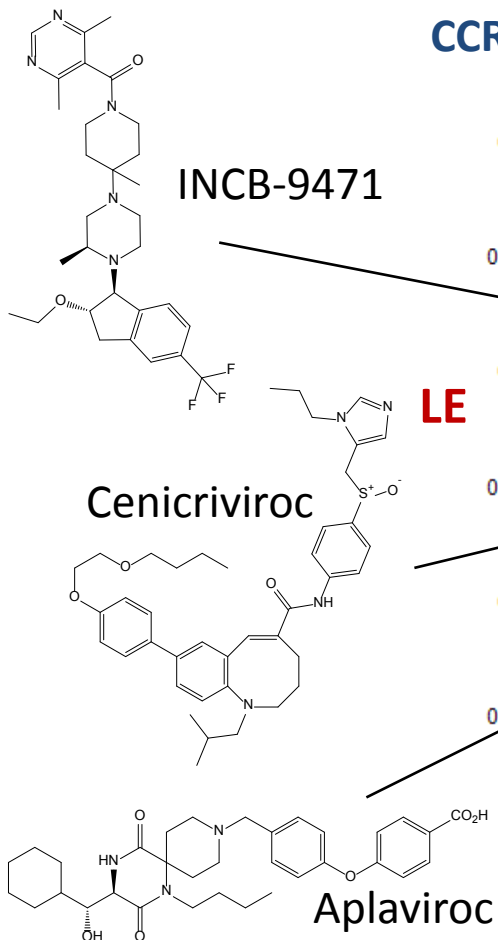
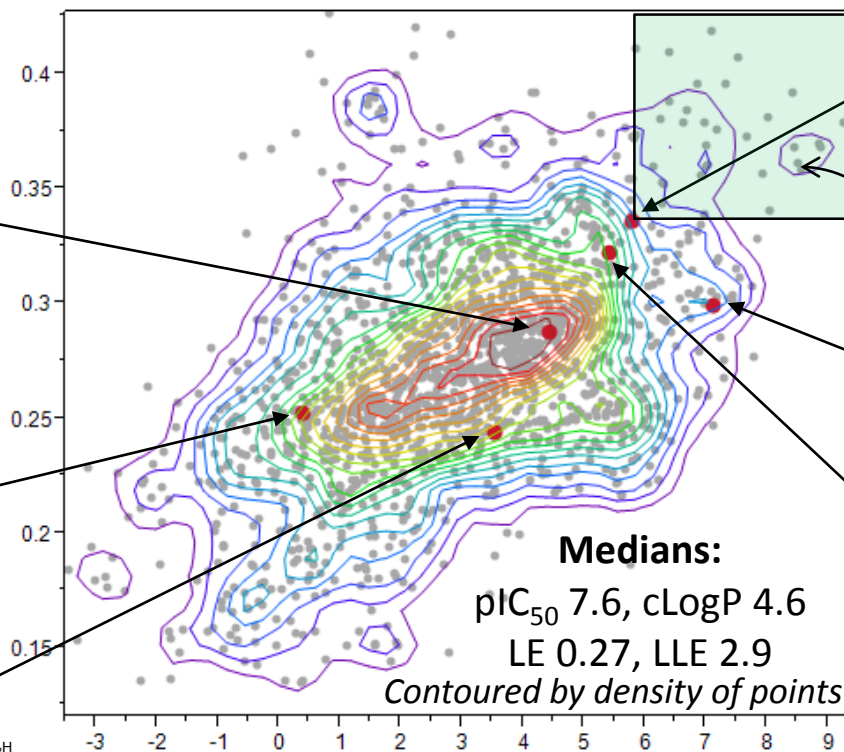
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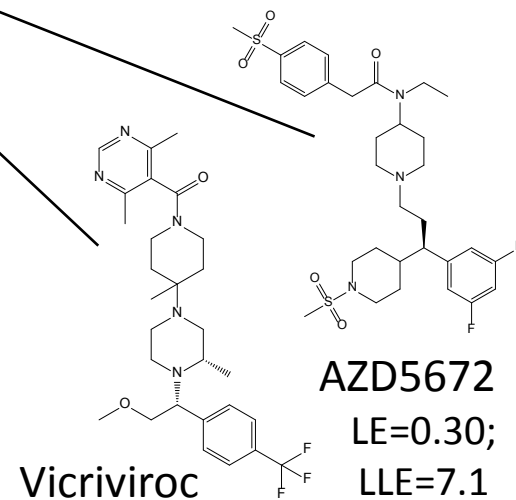


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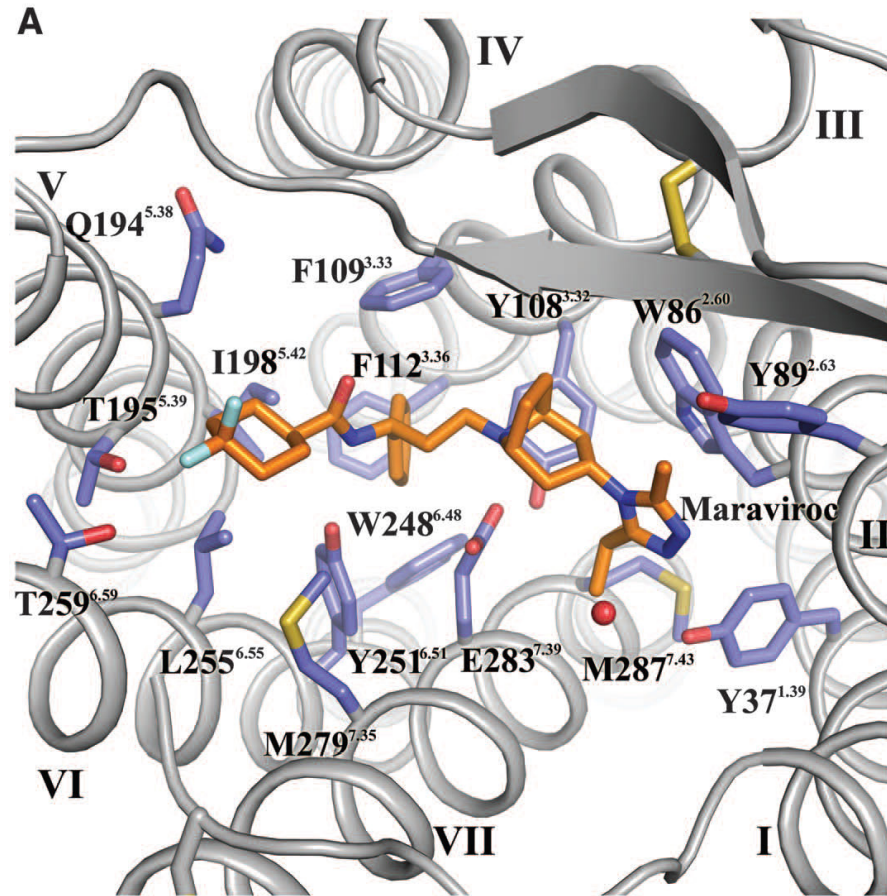
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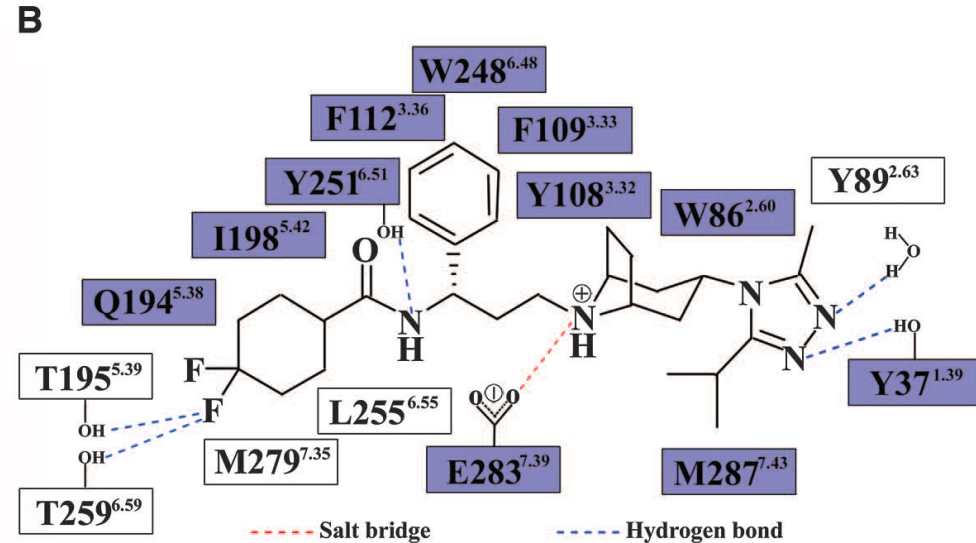
1.4% Molecules with better LE & LLE



Structure of Maraviroc Bound to CCR5



Maraviroc dissociation:
 $t_{1/2}$ 6.4hrs

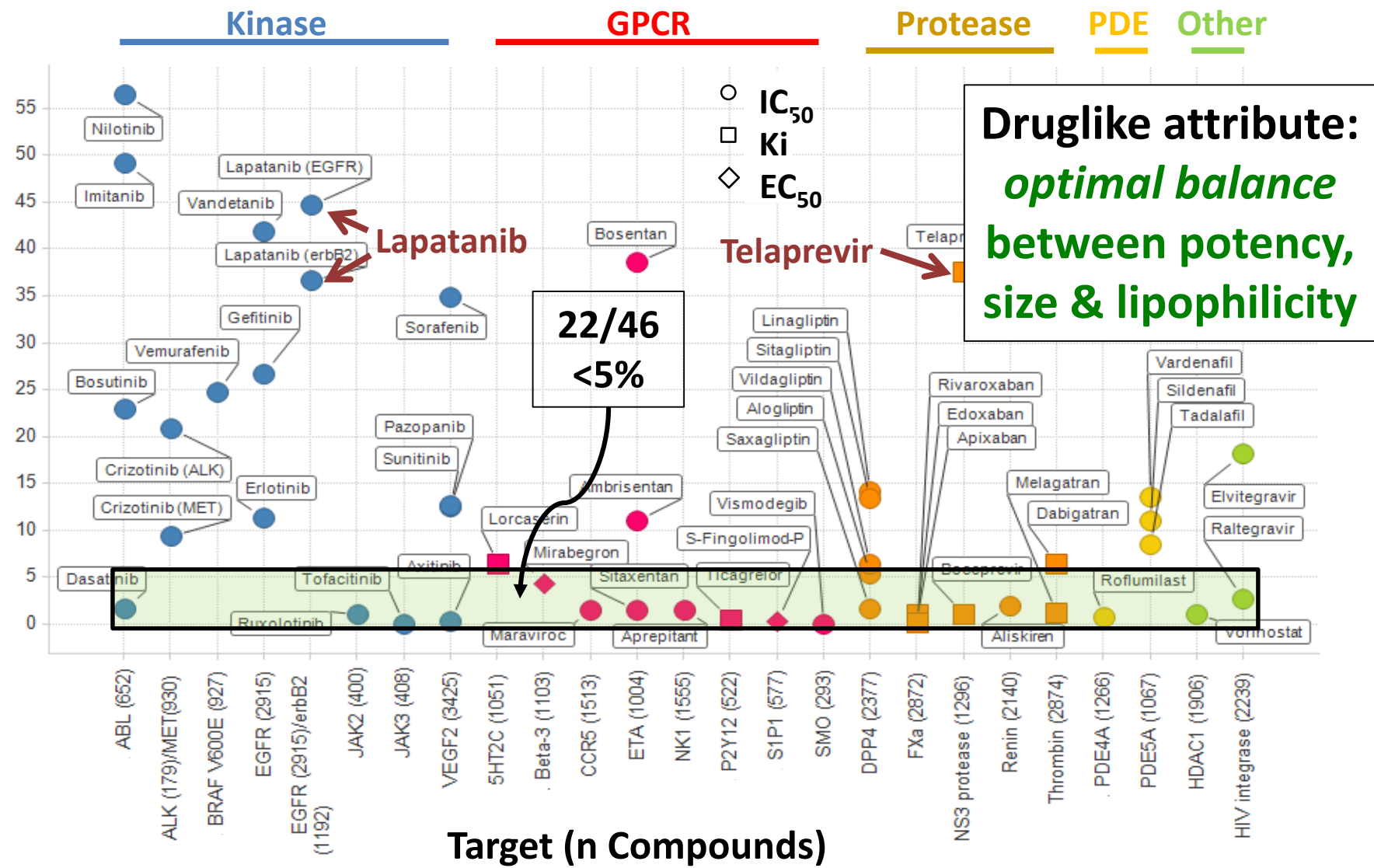


- **Efficient use of H-bonding atoms**
 - 7 Polar atoms make 6 polar interactions: enthalpy \uparrow
- **Efficient local hydrophobic interactions**
 - Phenyl, isopropyl, tropane & cyclohexyl binding pockets

Oral Drug Ligand Efficiencies: 46 Drugs, 25 Targets

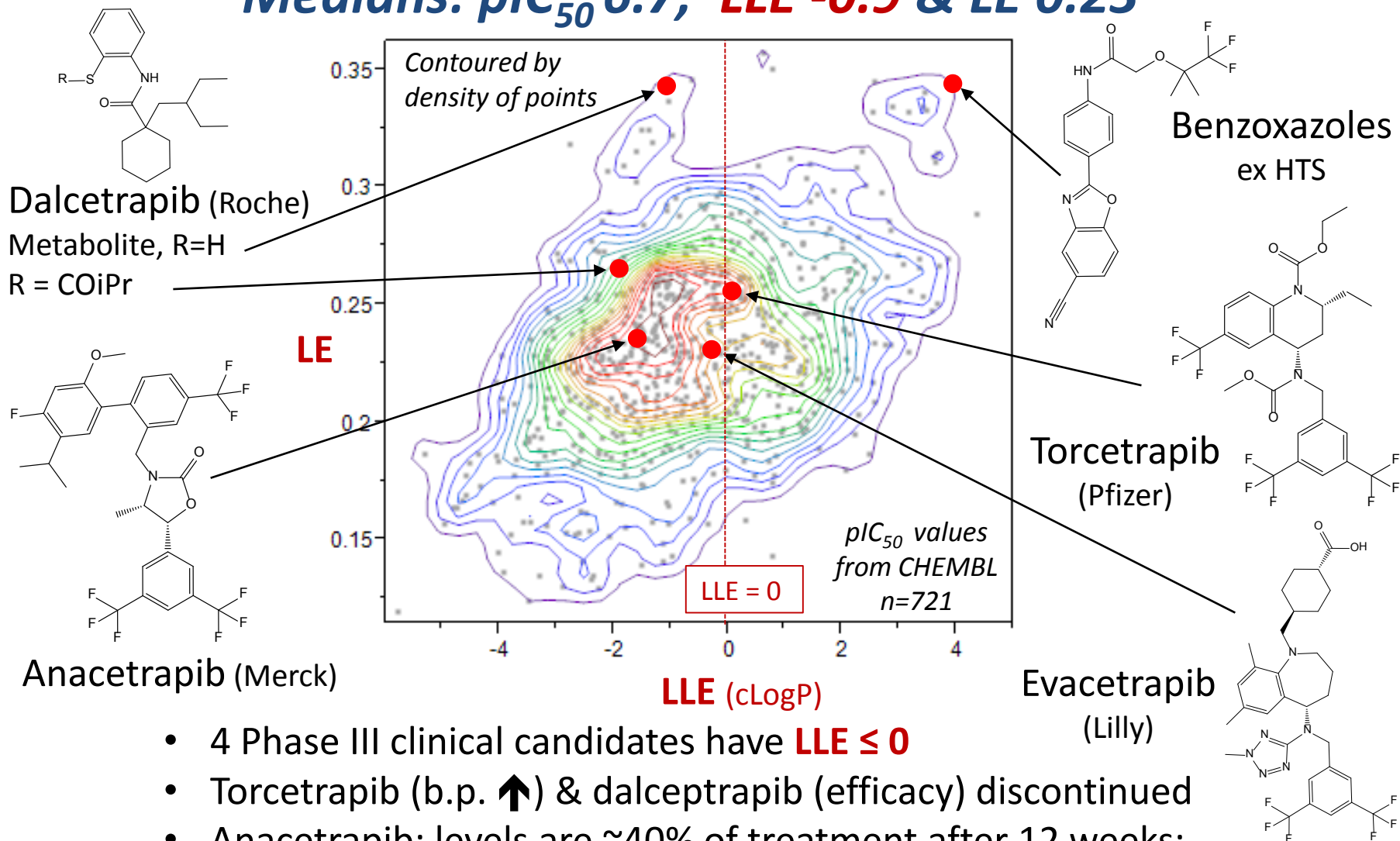
% LE + LLE better vs drug: kinases 22%; other targets 2.7%; only in class 1.5%. LE & LLE contribute equally to % score

% Compounds with both LE & LLE better than drug



CETP: A High Value 'Lipophilic' Target

Medians: pIC_{50} 6.7; **LLE -0.9** & **LE 0.23**

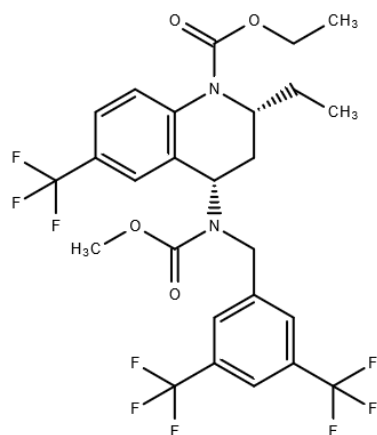


- 4 Phase III clinical candidates have **LLE ≤ 0**
- Torcetrapib (b.p. \uparrow) & dalcetrapib (efficacy) discontinued
- Anacetrapib: levels are $\sim 40\%$ of treatment after 12 weeks; detectable in plasma four years after last dose

CETP: Designing Less Lipophilic Inhibitors

***C* → *N* & *O*, hydrophilic substituents, control HA**

Fernandez et al (Lilly), *Bioorg. Med. Chem. Lett.* 2012, **22**, 3056



Torcetrapib (Pfizer) pIC₅₀ 7.7

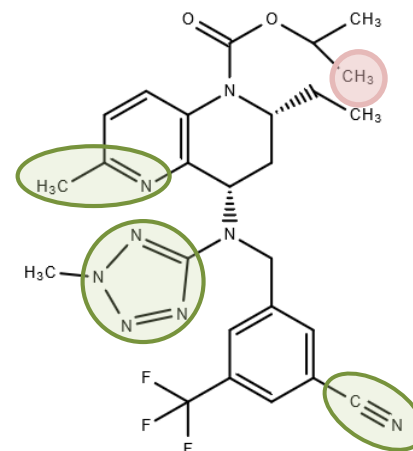
cLogP 7.6; HA 41; **LLE 0.1**; LE 0.26

'Mitigate lipophilicity'

LogP values
not cited

Δ LLE = 3.8

Δ LE = 0.01



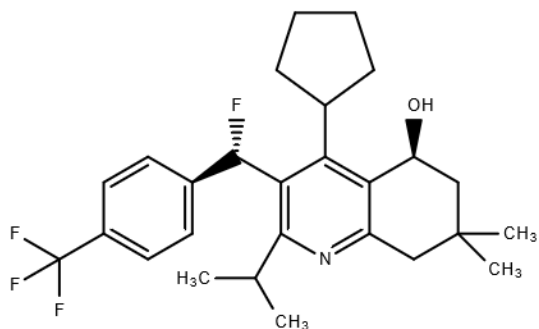
Lilly lead pIC₅₀ 7.7

cLogP 3.8; HA 39; **LLE 3.9** LE 0.27

LE + LLE
% better

1.4%

Trieselmann et al (BI), *J. Med. Chem.* 2014, **57**, 8766



BI hit pIC₅₀ 6.6

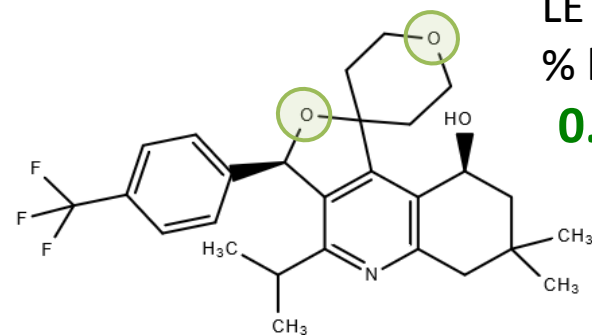
cLogP 7.6; HA 33; **LLE -1.0**; LE 0.27

'Reduce lipophilicity'

LogP values
tracked

Δ LLE = 4.1

Δ LE = 0.04



BI lead pIC₅₀ 7.7

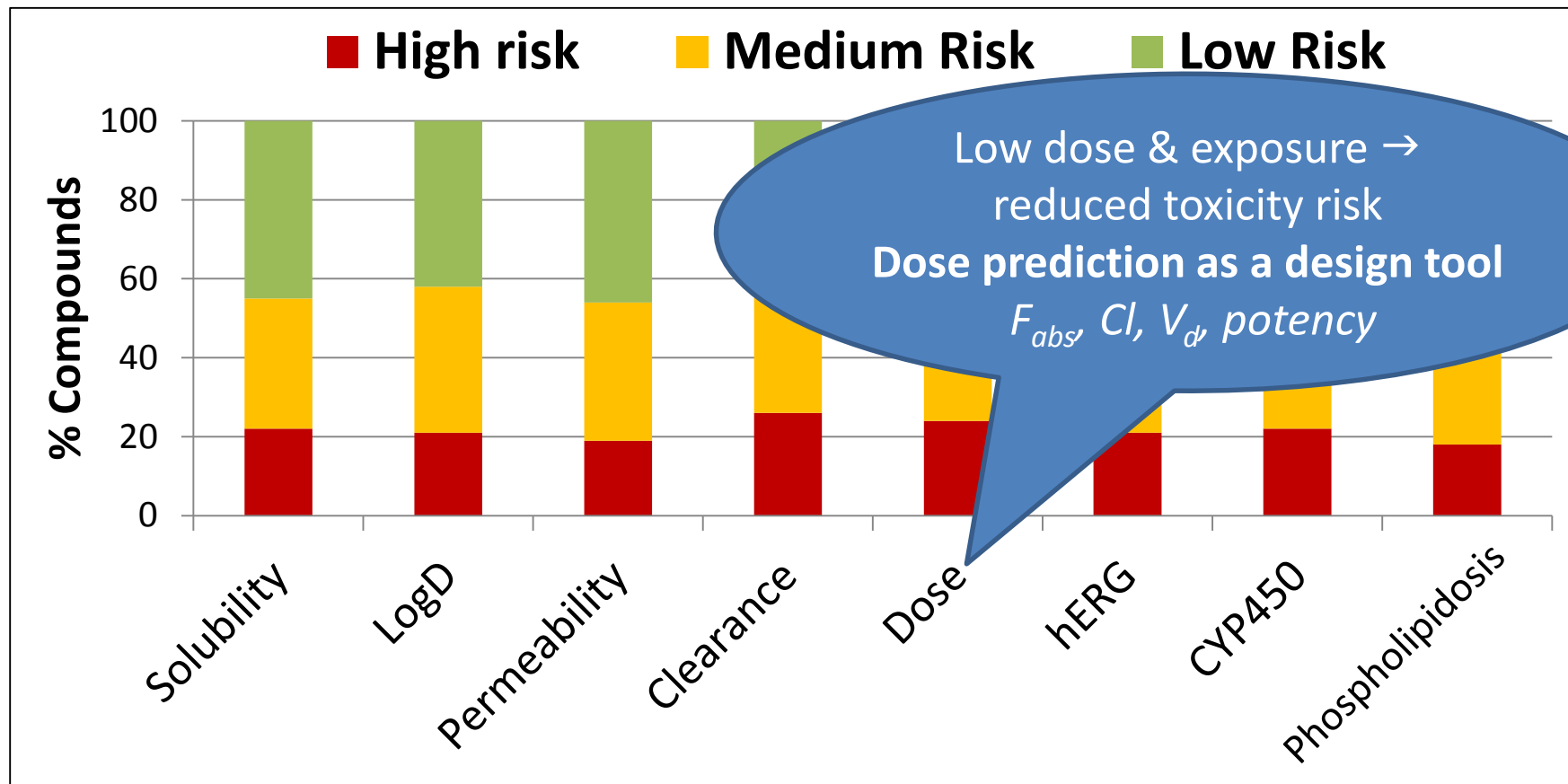
cLogP 4.6; HA 34; **LLE 3.1**; LE 0.31

LE + LLE
% better

0.28%

Controlling Risk: Compound Quality Guidance

Global & project predictive ADMET models: use pre-synthesis



- **If prediction is poor, why synthesise?**
- Using predictive models, AZ improved candidate drug **solubility**
- **'Virtual medicinal chemist' – Σ tools using existing knowledge**

Predictive chemistry: Cumming et al, *Nat. Rev. Drug Disc.* 2013, **12**, 948; **Dose prediction:** Grime et al, *Mol. Pharmaceutics*, **2013**, **10**, 1191; **Multi parameter opt'n:** Segall, *Curr. Pharm. Des.*, 2012, **19**, 1292; **Matched pairs:** Dossetter et al, *Drug Disc. Today* 2013, **18**, 724; **Automated design:** Besnard et al, *Nature*, 2012, **492**, 215

Designing Better Compounds

- Conduct multi parameter biology/ADMET optimisation
- Engage computational chemists & ADMET experts in design decision-making
- Seek leadlike starting points. Drop unpromising series; have back-up hit & lead generation plans
- Control physicochemical properties, especially lipophilicity; optimise ligand efficiencies & solubility
- Employ advanced computational chemistry tools; don't make compounds with poor predicted properties
- Reduce reliance on 'easy' synthesis & catalogue building blocks
- Learn constantly from past experience, avoid bias, consult others, challenge dogma
- **Never compromise on candidate compound quality**
- ***...and persist***

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Mark Wenlock

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Academia & Industry

Paul Gleeson

Andrew Hopkins

György Keserű

Tudor Oprea

David Rees

Chuck Reynolds

‘Minimal hydrophobicity’ in drug design. “Without convincing evidence to the contrary, drugs should be made as hydrophilic as possible without loss of efficacy.”

C. Hansch, J.P. Björkroth & A. Leo, *J. Pharm. Sci.* 1987, **76**, 663-687