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Optimizing Hits for Oral Activity and Dose

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Todays Presentation: Optimizing Hits for Oral Activity and Dose

- Where this work fits in versus drug discovery roadmap



Strategy and Plans Vary Based on What Information is Available

- Design cycles are intentional and are focused on a hypothesis



Growing usage of in silico predicted properties and eADME pre-synthetically



Role and Skills of Medicinal Chemist

- Design safe & effective agents to treat disease (drugs) with optimum *in vivo* activity after oral administration

Designing drugs for optimum *in vivo* activity after oral administration is a balance of multiple parameters

- The term "multi-parameter optimization" (MPO) has been coined to capture the need to target a balanced profile between on target efficacy, off target efficacy and ADME properties
 - Efficacy the ability to produce a desired result and involves potency (how tightly you interact with target protein) and effect (ability to elicit desired functional response)
 - ADME is the sum of absorption, distribution, metabolism and excretion for a given molecule

MPO avoids pursuit of potency alone ("K_i is king")

- Deep knowledge of organic chemistry (e.g. conformers, energetics, P-chem)
- ✓ Knowledge of factors that influence ADME (absorption, distribution, metabolism and excretion) of drugs both *in vitro* and *in vivo*
- Knowledge of pharmacology, toxicology and safety for ontarget and off-target effects
- ✓ Appreciation of patent and competitive intelligence, chemistry/biology information
- Basic understanding of clinical and regulatory requirements for disease target and for related drugs
- Familiarity with techniques and tools to assess biology and chemistry, and facility with a broad range of design and analysis tools
- Knowledge of in silico techniques to ideate and predict small molecule properties and eADME endpoints

Drug design is making the best choices before synthesis—excellence in design can save you a lot of time, but it also demands a commitment to learning and a highly skilled synthetic team

Goal of Small Molecule Project Team is to Design Orally Efficacious Drugs

- Knowing some biology helps medicinal chemist better leverage the dose equation in optimization phase



Pharmacology related to unbound concentration at site of action (AUCu or Css,u)

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The Drug Discovery Equation Has Not Changed, Still an MPO Problem

DRUG = a[potency] • b[efficacy] • c[selectivity] • d[absorption] •
e[distribution] • f[metabolism] • g[excretion] • h[side effects] •
[acute/chronic toxicity] • f[mutagenicity] • k[solubility] •
[formulation] • m[taste] • n[smell] • o[stability] • p[cost] •
q[patentability] • r[clinical efficacy] • s[idiosyncratic problem]

- · Overall likelihood of success a product of the individual probabilities
- Candidate drug deficiencies can be helped by chemical modification
 - Pharmacodynamic properties
 - Pharmacokinetic properties
 - Toxicological profile
 - Pharmaceutical properties
 - Other issues
- Best drug design balances optimization of these versus timely delivery

Target Product Profile (TPP)

Drugs Only Represent a Small Fraction of Synthesizable and Stable Molecules



Key principle: Design is about <u>making the right choices</u>.

Only a fraction of structures are in drug space; and only a tiny number of those can be superior and will become drugs

Physicochemical Properties of Oral Drugs On the Rise (1982-2004) but Still Acceptable

- Multiple factors could be responsible including pursuit of potency, more diverse modalities and target classes

Parameter	1980's	1990's	2000's	Total
NAR	1.25	1.6	1.9	1.41
Fsp3	0.44	0.44	0.43	0.44
MWt	328	365	377	344
LogD	1.2	1.9	2.0	1.5
cLogP	2.0	2.5	2.6	2.2
tPSA	77.4	81.5	84.9	79.4

Hopkins et al., Nature Biotechnology (2006), 24(7), 805-815

Lipinski Ro5 rule of fives for oral drugs <500 mw, <5 ClogP, <5 HBD, <10 HBA

Space of highest concentration of drugs cLogP 2-4, MW 250-400

- On average in the last three decades drugs have become more lipophilic, more aromatic, have higher molecular weight, and more polar.
- In general though, drugs on average have low lipophilicity and molecular weight.
- Higher probability of oral efficacy around "drug like space"
 - Know these properties the moment you conceive of a molecule

Serum Protein Binding Carries Potential Benefits and Potential Risks

- Can prolong duration of action but high log P/D tracks with compound promiscuity and low free drug concentration

- Binding of a drug to plasma proteins...
 - <u>Benefits</u>: prolongs duration of action ("drug reservoir"), limits metabolic clearance of poorly extracted drugs, *may* increase distribution (V_D) of insoluble compounds
 - <u>*Risks*</u>: concentration of "free" (i.e. active) drug reduced, may limit distribution into tissues, increased promiscuity

Kratochwil, N. et al, *Biochem. Pharmacol.* **2002**, *64*, 1355 Leeson and Springthorpe, Nature Reviews, Drug Discovery, 2007, 881



Protein binding in plasma and accumulation in blood cells in suspension increases with increasing lipophilicity

If Polarity Dominates Profile, Risk of Poor Absorption Increases - Role of PSA and Number of N+O, balance is best



Anisole: TSA=145; PSA=9

Excessive molecule polarity can inhibit dissolution in and transport through non-polar CNS and intestinal membranes

- Rule-of-thumb: PSA= 13 x (N+O atoms) Norinder, U. et al. *Adv. Drug Del. Rev.* **2002**, *54*, 291
- PSA <90 Å² good BBB penetration Ertl, P. et al. *J. Med. Chem.* **2000**, *43*, 3714 Clark, D. et al. *J. Pharm. Sci.* **1999**, *88*, 815
- PSA <140 Å² good oral bioavailability Veber, D. et al. *J. Med. Chem.* **2002**, *45*, 2615
- PSA 200-250 Å² is upper limit for any minimally useful bioavailability Norinder, U. et al. J. Med. Chem. **2001**, 44, 1927
- Odds of toxicity
 - High-clogP/low-TPSA compounds are approximately 2.5 times more likely to be toxic as to be clean with a 6X odds ratio
- Tox data from 245 pre-clinical candidates, BMCL 2008, 4872

Impact of Common Pharmacophoric Units on clogP

ClogP	
4.0	
3.2	
2.9	
2.6	
2.1	
2.1	
1.6	
1.5	
1.3	
0.9	
0.5	
	ClogP 4.0 3.2 2.9 2.6 2.1 2.1 1.6 1.5 1.3 0.9 0.5

+2 for phenyl unit +0.5 for CH₂ unit

neutral for OCH₃

-0.5 for OH -1 for aniline NH₂ -1.5 for sulfone

Optimal ADME Space Matches Oral Drug Space

- Very similar Physicochemical Properties



Color by Clint,u <10, PAMPA >1.5, CLND >10: Yes No

Parameter	Average Green	Average Drugs	
clogP	2.3	2.2	
LogD	1.91	1.5	
MWt	351	344	
TPSA	66.7	79.4	
FSp3	0.35	0.44	
NAR	2.25	1.41	

Structural Mnemonics Help Increase Probability of Success During MPO-Design Phase

600

300 200

- Mostly physicochemical and structure based (for favorable profiles, and away from risky profiles)

- Lipinski Ro5 rule of fives for oral drugs <500 mw, <5 ClogP, <5 HBD, <10 HBA
- Pfizer 3/75

<3 LogD, >75 A^2 TPSA total polar surface area

- 'Golden Triangle'
- and many others . . . QED, rot bonds Veber, Ro4, Ro3 phospholipidosis index, BCS, CNS MPO
- Efficiency measures (potency vs. properties, i.e. LLE, LipE, BEI)
- Toxicophores (e.g. FDA/yellow/red/orange structure alerts)
- PAINS, promiscuous aggregators, 'red herrings'



Probabilistic yes, but traverse at risk: "Cost-efficient modern drug discovery has a substantial statistical component to it: Envelope pushers need to have the resources to take on the higher risks" (Jorgensen, *Science* **2004**, 1813)

Drugs are Composed of Pharmacophoric Units

A drug drives its effect through a *molecular target* (Paul Ehrlich, 1854-1915)

- A *pharmacophore* is a representation of the minimal essential ligand elements needed to drive that interaction
- 90% of drugs have 3-9 binding elements (polar and non-polar groups)

P2

- 1-5 H-bond donors
- 0-10 H-bond acceptors
- 5-30 hydrophobic atoms

<u>Why</u>? These define the pharmacophore

- Control binding strength, specificity
- Control physicochemical properties
- Reflects range needed for potent binding to target

Kratochwil, N. et al. *Biochem. Pharmacol.* **2002**, *64*, 1355 Bemis, G.; Murcko, M. *J. Med. Chem.* **1996**, *39*, 2887 Cereto-Massague, A. et. Al. *Methods* **2015**, *71*, 58 A. M. Davis and S. J. Teague, Angew. Chem. Int. Ed. 38, 736-749 (1999)

Methyl can be a pharmacophoric unit or it can participate in shielding of the acid (or both)

- High polarity of acid may limit passive absorption and alpha methyl group may shield the acid and thus increase passive permeability
- Binding to protein target is a combination of electrostatics, conformation/shape and hydration



Each Pharmacophoric Unit Contributes to Affinity and Selectivity - Magnitude of Different Molecular Interactions

Electrostatic H-bonds (one partner charged) H-bonds (both partners neutral) Hydrophobic Hydrophobic Cation- π π -stack Halogen bond Dipole-Dipole Induced Dipole-Dipole Electrostatic (Repulsive)

- 0-4 kcal/mol (per interaction) 0-3 kcal/mol (per interaction) 0-1.5 kcal/mol (per interaction) 0-0.8 kcal/mol (per -CH₂-) 0-3 kcal/mol (per benzene ring) 0-1 kcal/mol (per aryl ring) 0-1.5 kcal/mol (per aryl ring) 0-0.5 kcal/mol (per halogen) really weak (a few tenths of kcal/mol) even weaker 0 to -4 kcal/mol (per interaction)
- •1.4 kcal/mole = 10x change in potency = 1 log unit
 - The above values refer to physiological conditions
- Does not account for water interactions

Biotin - Avidin, $K_d = 1$ fM (PDB 1AVD)



- 7 H-bonds
- 8 hydrophobic interactions
- 4 Rotors
- 0 Electrostatic interactions
- 0 bound waters

Conformation Matters to On and Off Target Binding

- Increasing number of rotatable bonds to allow fit in a pocket comes with a penalty

Every rotatable bond you have in your molecule could cost you about 0.5 log units in potency. Note: this number is never zero--there is always some penalty.

There is an entropic penalty that must be paid when a molecule has to go from multiple conformations in solution to a single conformation in a target site, e.g. The simplest case of a rotatable bond: Butane



At equilibrium, there is 66% trans and 34% gauche. K_{eq} = 1.9

corresponds to $\Delta G = 0.4$ kcal/mole energy difference. 0.3 of a log-unit energy difference.

- 7 rotatable bonds could be a 3 log <u>penalty</u> in potency.
- With this many conformations, the molecule is likely spending very little time in a conformation appropriate for receptor binding

Relationship of Rotatable Bonds to Bioavailability and Safety

- Rigidification is a strategy used to decrease off target activity



Poor Membrane Permeability Can Also Contribute to Poor Bioavailability (F) - Correlated to Poor Absorption, Poor F%

Veber, D. et al. J. Med. Chem. 2002, 45, 2615



- •Highly polar molecules can have poor permeability
- Highly flexible molecules can have poor permeability

•PSA <140 Å² good oral bioavailability

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Polarity and Flexibility Can be Leveraged for Tissue Restriction

Dorel, et. al. ACS Med. Chem. Lett. 2023, asap





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Role of Water in Design and Selection of Analogs for Synthesis



1-Log gain in affinity from water displacement

Need to understand the energy of the water $\Delta G = \Delta H - T \Delta S$

- Disordered (high entropy) vs. ordered
- Stable in protein vs. stable in water network
- Schrodinger WaterMap
 - Displace, replace, interact, avoid

"Structure-Based Characterization and Optimization of Novel Hydrophobic Binding Interaction in a Series of Pyrrolidine Influenza Neuraminidase Inhibitors," Maring, C. J. et al., *J. Med. Chem.* **2005**, 48, 3980-3990.



Blood/Plasma Exposure Blood is the most readily accessible body fluid



Plasma contains many vital proteins (e.g. fibrinogen, globulins, albumin) - Plasma protein binding

Systemic Circulation

Efficacy = Potency + Exposure Translation of efficacy requires translation of both potency and exposure



Physicochemical Properties, ADME and Physical Properties are All Important to Dose - Dose limiting absorption can kill otherwise good compounds

Yee, S. Pharm Res. 1997, 14, 763 (adapted from R. Sawchuk, U. of Minn (2001), "Pharmacokinetics & Drug Development")

Property	Low Risk	Medium Risk	High Risk
Log P	1-3	3-4	<0 or >5
P _{app} (x10 ⁶ cm/s)	>20	2-20	<2
Solubility (µg/mL)	>1000	10-1000	<10
HLM, t _{1/2} (min)	>200	50-200	<50

What's Good?

Additional confounds in the DMPK/formulation profile (for animal tox, or human clinical form):

- Instability (chemical or enzymatic) in lumen, metabolism (especially first-pass metabolism), efflux transport (e.g. P-glycoprotein), high crystallinity, high melting point, slow intrinsic dissolution rate, hydrolytic, thermal, or photoinstability, incompatibility with excipients, multiple polymorphs, emergence of low solubility polymorphs

Recent Progress in Drug Design Focused Around Pre-synthetic Modeling

- No method currently captures shape, electrostatics and conformation

Muegge et. al. (2016) Expert Opin. Drug Disc., 11:2, 137-148 Rogers, et. al., J. Chem. Inf. Model. 2010, 50, 742-754 You, et. al. Signal Transduction and Targeted Therapy (2022) 7:156

It is possible to describe a drug in a way that a computer can understand and manipulate it



• Computationally useful for screening but does not capture conformation, shape or other three-dimensional characteristics and tautomers (current limitation of how a model is defined including some graph networks)

It is Also Possible to Enumerate Billions to Trillions of Potential Structures -37 billion compounds that are able to be purchased



Tingle, et. al., J. Chem. Info. Model. 2023, 63, 1166

Significant expansion of virtually enumerated chemical space to billions of virtual compounds

Cannot enumerate forever however

Companies taking a fragment/reaction approach to library design and screening

- a X b X c library reactions similar to a DEL (DNA encoded library)
- Chooses reaction based on need
 - Feature Trees (F-Trees)
 - Tanimoto similarity
 - Substructure...

Role of Medicinal Chemist Has Evolved

Expert Medicinal Chemist

• Synthetic Expert



- "Magic methyl"
- What a drug looks like
- Design as an art





Lead

"I think this looks like a drug vs. ummm . . . this looks ugly'



- Chemists use pattern recognition to develop opinions based on specific experiences
- Computers are great at pattern recognition

Expert Medicinal Chemist

- Synthetic Expert
- Computationally savvy
- Team approach
- Methyl displaces a high energy water
- Selectivity within protein family is attainable due to conformational differences in the proteins
- Can predict affinity and solubility with physicsbased methods like FEP
- Drug like space can be identified and probability of compounds outside this space becoming drugs can be better understood
- Design is intentional and is built around a hypothesis in each design cycle
- In silico techniques are leveraged presynthetically

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