



Predictive ADME Models in Drug Discovery: Can You Trust Them? Can You Afford Not To?

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BioFocusDPI
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ADMEnsa
Bringing balance to optimization



Drug Discovery: Requires Prediction

Med Chem

Novel
Pure
COG
Safe



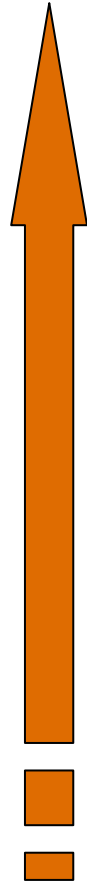
Potent
Selective
Effective
Safe

ADMEt

Appropriate
PK
Safe



Drug Discovery: ADME Prediction



In Silico
Throughput

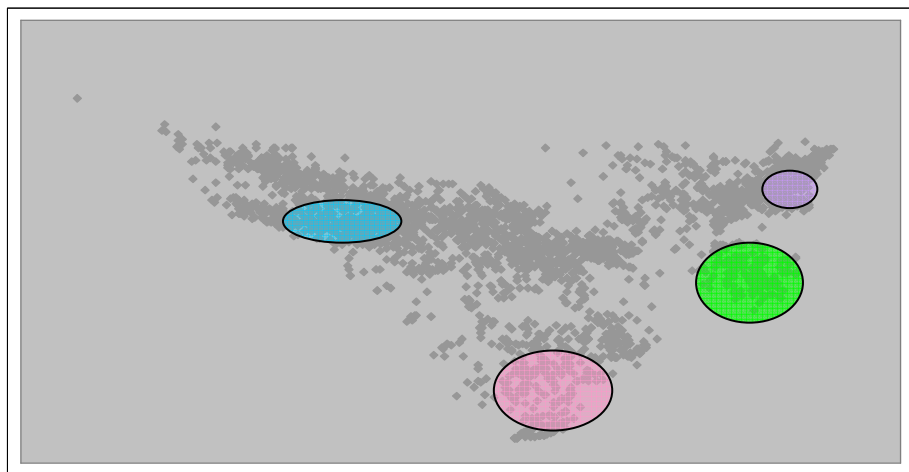
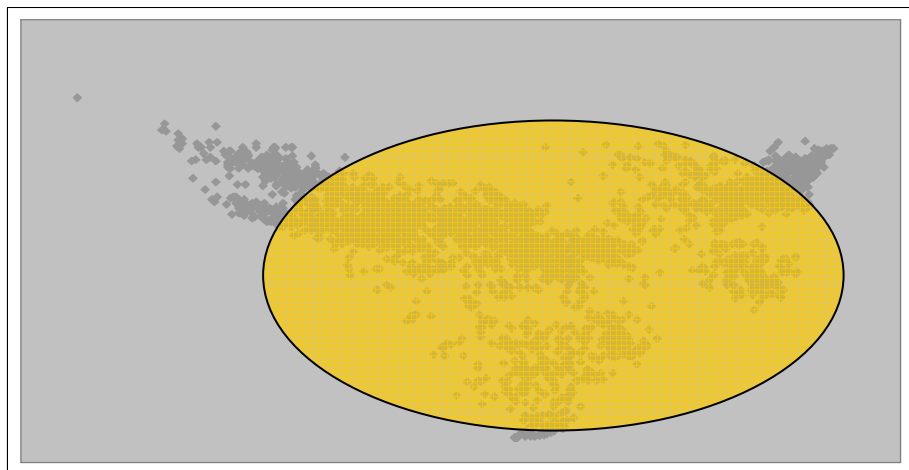


Credibility?



Drug Discovery: ADME Prediction

In Silico



Credibility?

Global Models

- Cover as much chemical diversity as possible
- Capture 'long-range' trends in properties
- May not differentiate between close analogues

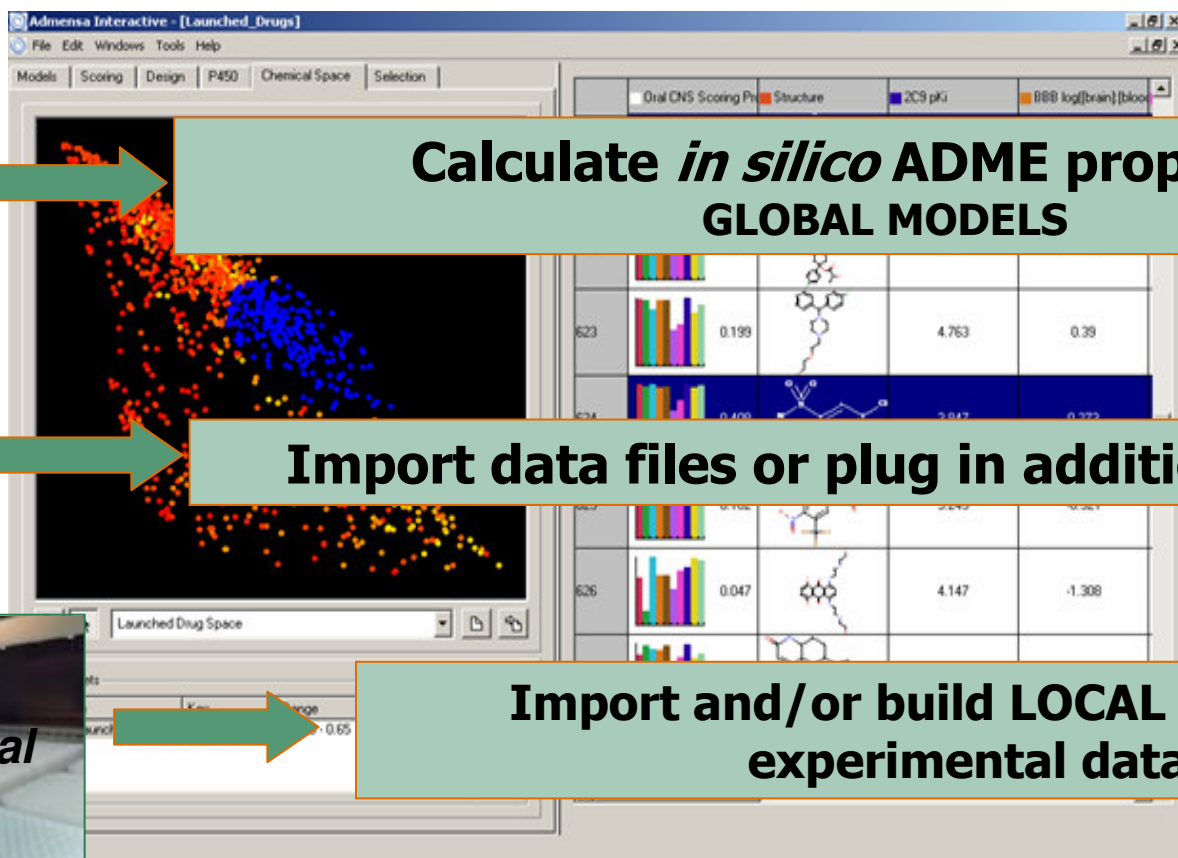
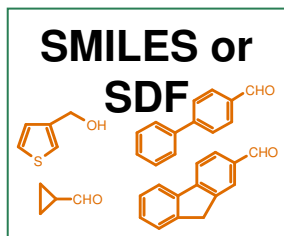
Local Models

- Based on data for specific chemistry
- May provide higher resolution for that chemistry
- Outside of 'chemical space' may rapidly lose predictive power



Drug Discovery: ADME Prediction

In Silico



Calculate *in silico* ADME properties: GLOBAL MODELS

Import data files or plug in additional models

Import and/or build LOCAL models on experimental data

User Interface: ADMEnsa Interactive™



Drug Discovery: ADME Prediction

In Silico

CYP1A2 Local Model build

- Training Set Results:
 - 55 compounds
 - 89% of the training compounds are correctly classified.
 - 18% false negative i.e. observed low predicted high.
 - 4% false positive i.e. observed high predicted low.

Training	<i>Predicted Low</i>	<i>Predicted High</i>	<i>%correctly classify</i>
<i>Observed Low</i>	25	5	0.83
<i>Observed High</i>	1	24	0.96
<i>% Compounds correctly assigned within a predicted class.</i>	0.96	0.82	



Likely error in prediction is “known”

- 79% validation compounds correctly classified
- 82% tests compounds correctly classified
- No false positive:
 - Highly confident in prediction Low
- Average false negative = 32%
 - ~32% of the predicted high could be observed low.

Validation	<i>Predicted Low</i>	<i>Predicted High</i>	<i>%correctly classify</i>
<i>Observed Low</i>	8	4	0.67
<i>Observed High</i>	0	7	100
<i>% Compounds correctly assigned within a predicted class.</i>	100	0.63	

Test	<i>Predicted Low</i>	<i>Predicted High</i>	<i>%correctly classify</i>
<i>Observed Low</i>	6	3	0.67
<i>Observed High</i>	0	8	100
<i>% Compounds correctly assigned within a predicted class.</i>	100	0.73	



Drug Discovery: ADME Prediction

In Silico

Score and rank compounds against Target Product Profile

User-defined scoring profile

Property	Desired Value	Scores
LogIC50	<-0.3	Above:0.1 Below:1
logS	>1.5	Above:1 Below:0.1
HIA category	+	+:1 -:0.1
logP	<3.5	Above:0.3 Below:1
hERG pIC50	<6	Above:0.4 Below:1
BBB log([brain]:[bl...]	<-0.5	Above:0.6 Below:1
2D6 affinity categ...	low medium	high:0.8 low:1 medium...
BBB category	-	+:0.6 -:1
P-gp category	no	no:1 yes:0.6
2C9 pKi	<6	Above:0.7 Below:1
PPB category	low	high:0.8 low:1

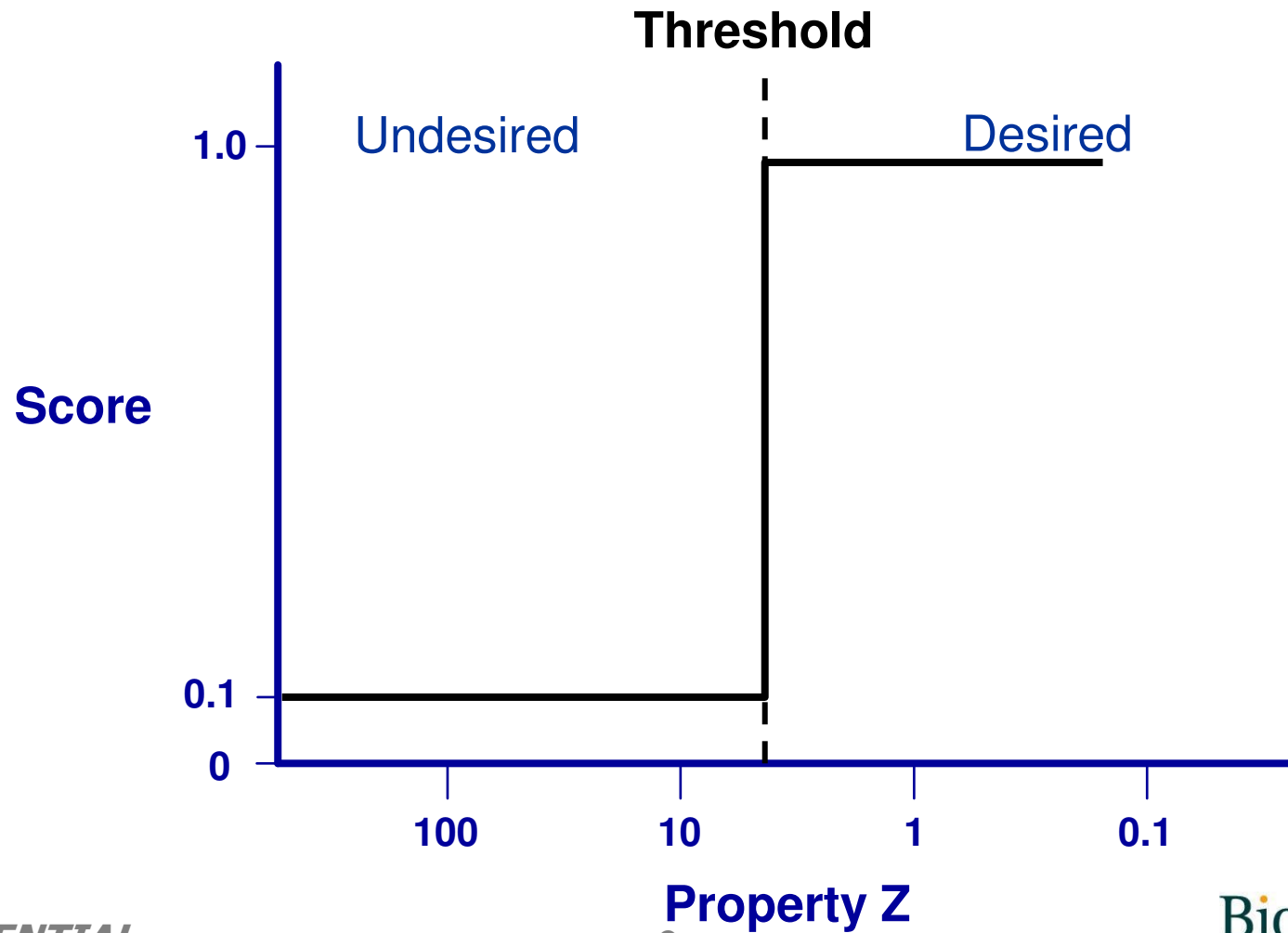
Diabetes	Structure	COMPOUND_NAME	LogIC50
0.371	<chem>CC(C)C1=CC=C(C=C1)N2C=CC(=O)N2</chem>	1'-isobutyl-3'-methyl-1H,2H,5H...	-0.409
0.371	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	2-(3-(2-(3-fluorophenylamino)-2...	-1.658
0.37	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	7-(N,N-dimethylsulfamoyl)-9-ox...	-0.398
0.367	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	5-(5-chloro-2-(pentylsulfonyl)pi...	-1.301
0.366	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	2'-(3,4-dichlorobenzyl)spiro[te...	-1.638
0.361	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	2'-(2,4-dimethoxybenzyl)spiro[te...	-0.456
0.356	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	6',8'-dichloro-3'-methyl-1H,2H...	-1.432
0.353	<chem>CC1=CC=C(C=C1)N2C=CC(=O)N2</chem>	2-(naphthalene-2-sulfonamido)...	-0.398

User Interface: ADMensa Interactive™

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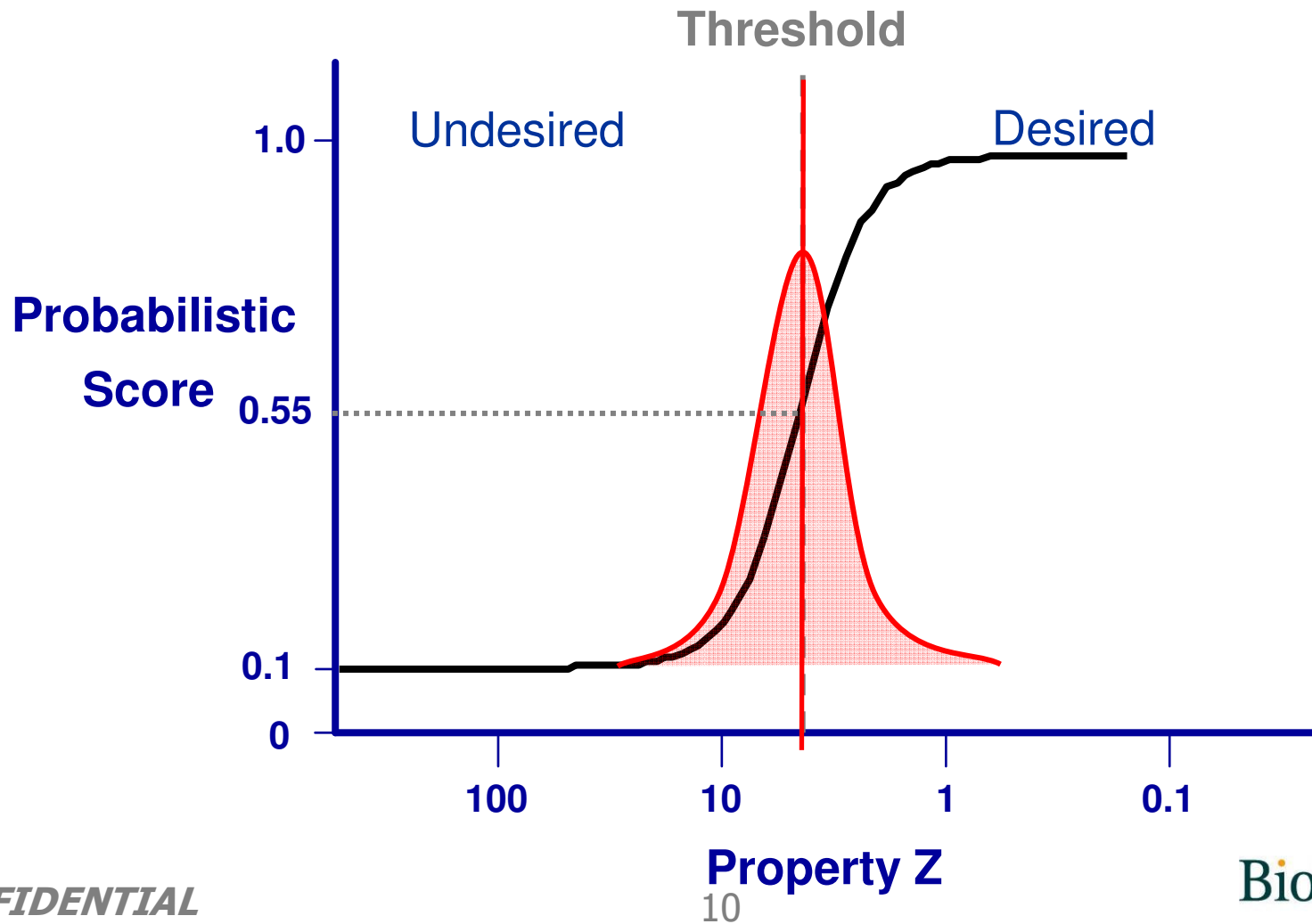


Filtering





Probabilistic Scoring



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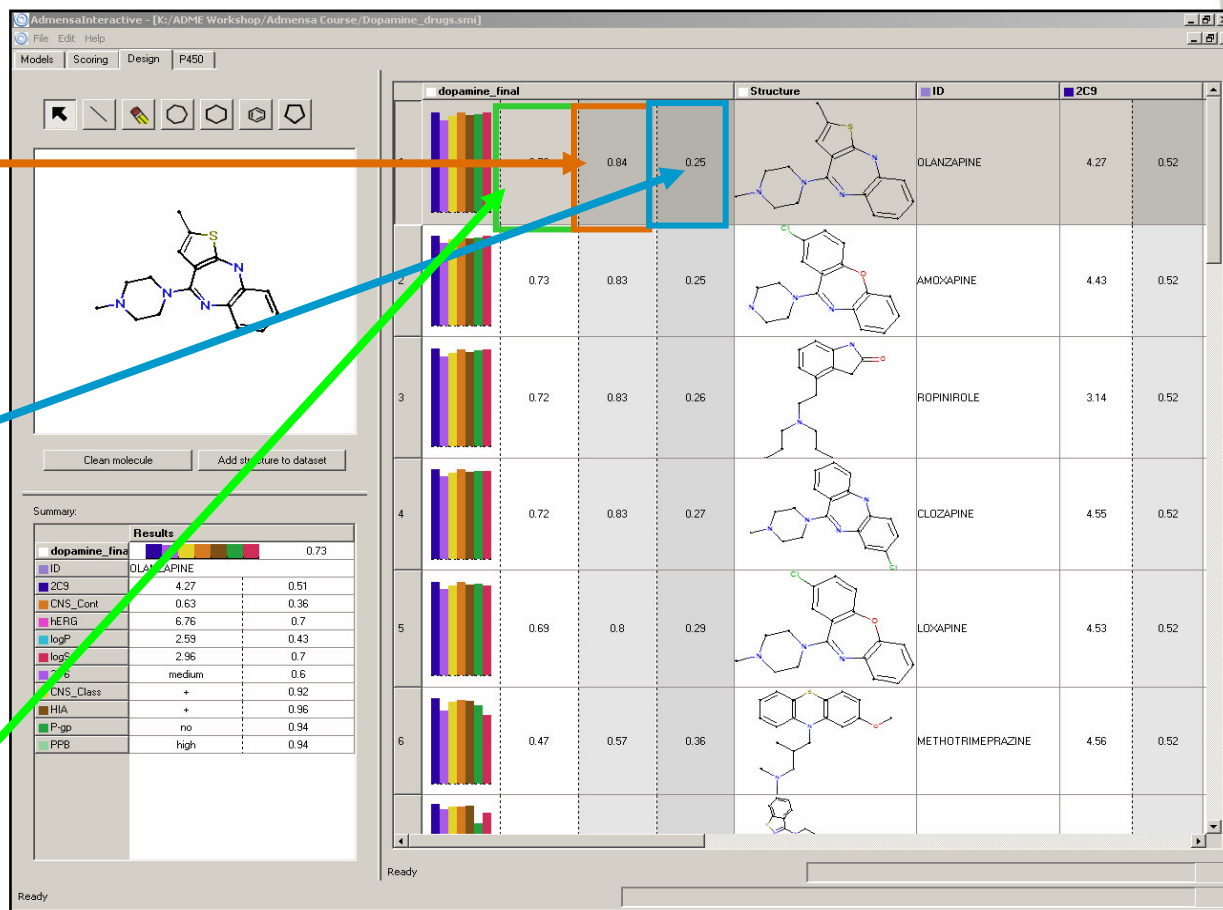


Probabilistic Scoring Score, Uncertainty and Rank

Score: The best estimate of the likelihood of success of a compound against the scoring criteria.

Standard deviation: A measure of the uncertainty in this estimate.

Rank: A 'utility value' enabling compounds to be ranked in order of priority, based on a combination of score and uncertainty

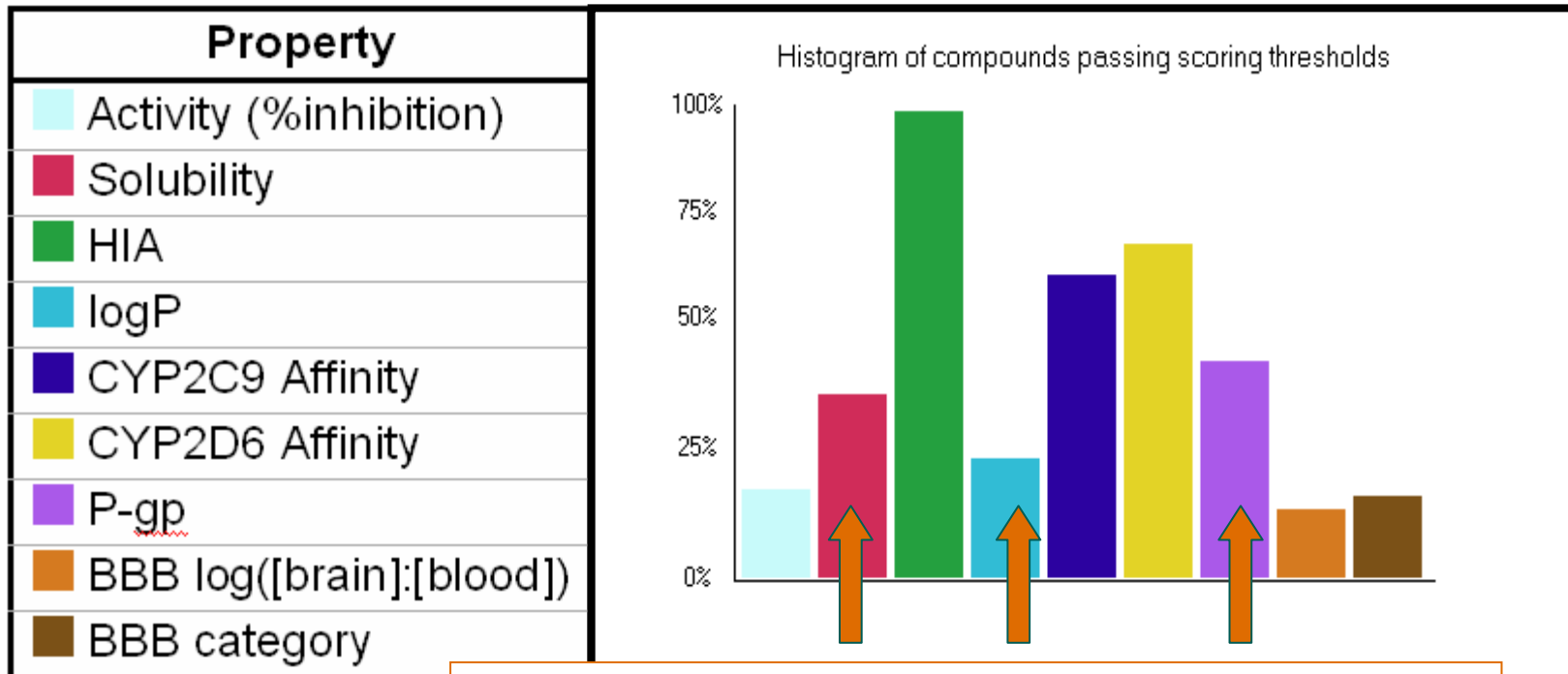




Drug Discovery: ADME Prediction

In Silico

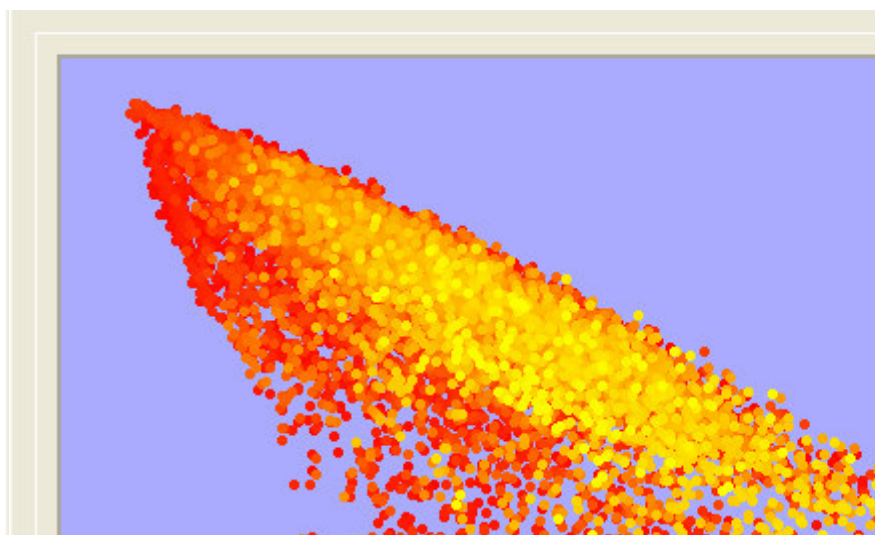
Overview of Entire Library against Target Product Profile



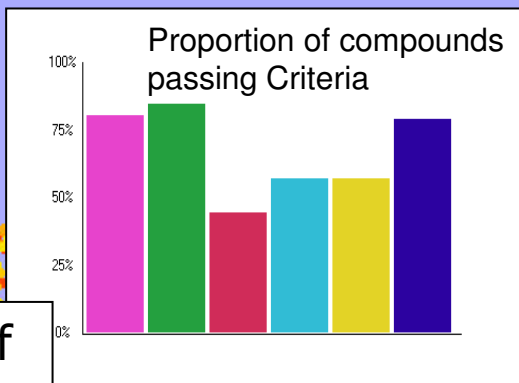
Risk of poor oral bioavailability?

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Colour-coded Rank Order in "Chemical Space"



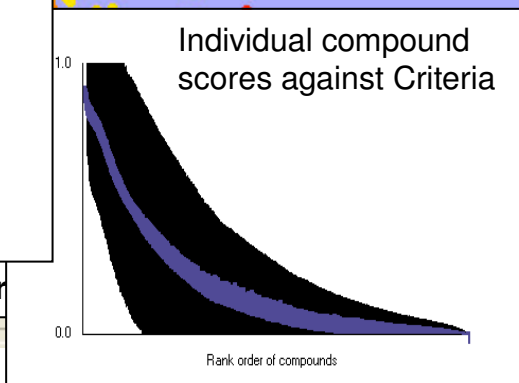
Criteria	
hERG IC50	>1uM
Absorption	+
Aq. Solubility	>100uM
Calc. logP	<3.5
2D6 IC50	>1uM
2C9 IC50	>1uM



"Good" compounds concentrated to right-centre of space as plotted

Limited proportion of soluble compounds

Limited no. of individual compounds pass most criteria



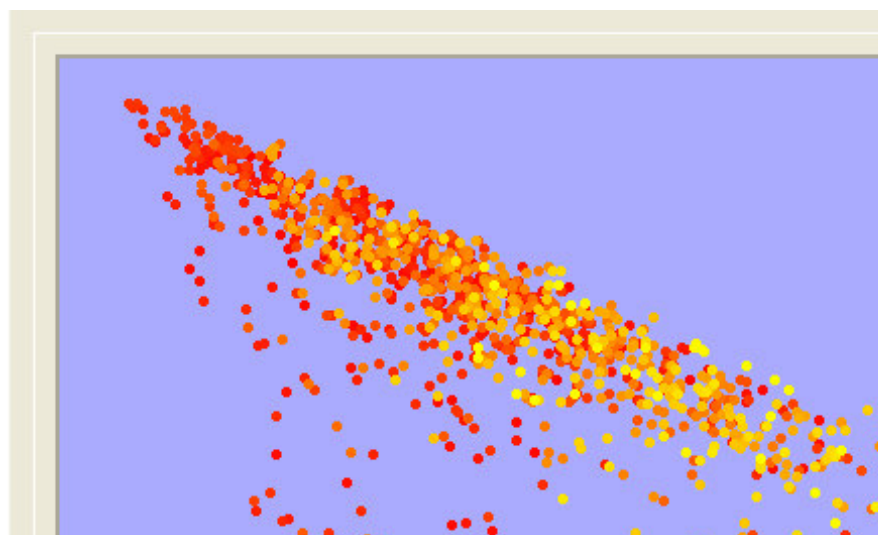
MDDR 20,000 random selection: scored for



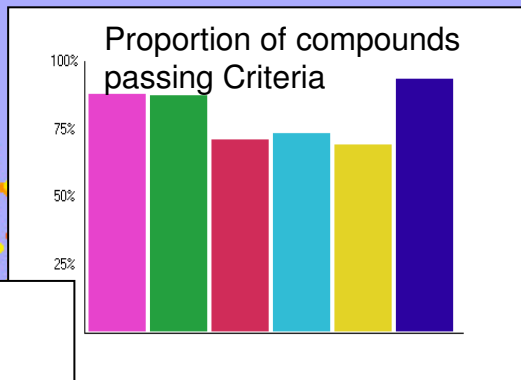
Colour-coded Rank Order in "Chemical Space"



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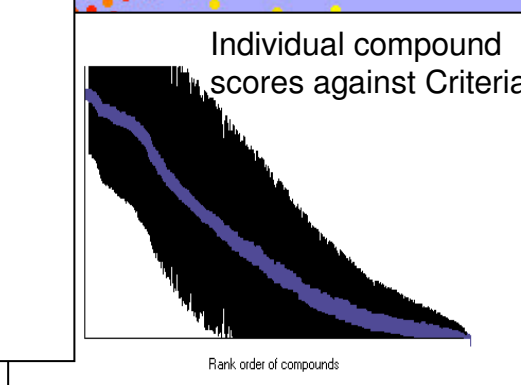
Criteria	
hERG IC50	>1uM
Absorption	+
Aq. Solubility	>100uM
Calc. logP	<3.5
2D6 IC50	>1uM
2C9 IC50	>1uM



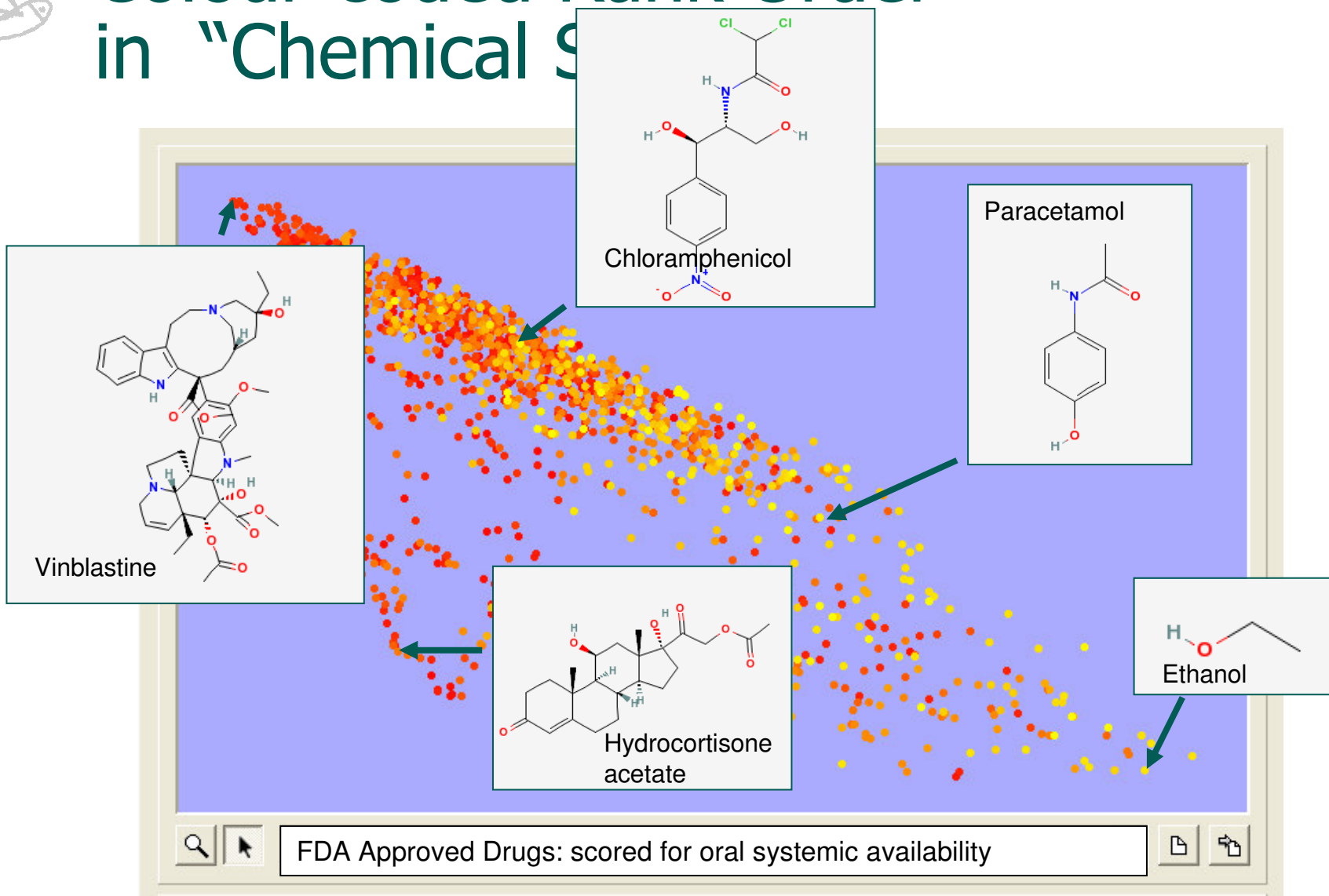
Higher proportion of compounds passing each criterion relative to MDDR set

Increased proportion of individual compounds passing most criteria

But – a number of compounds which would not appear to be good starting points in an oral drug discovery programme!

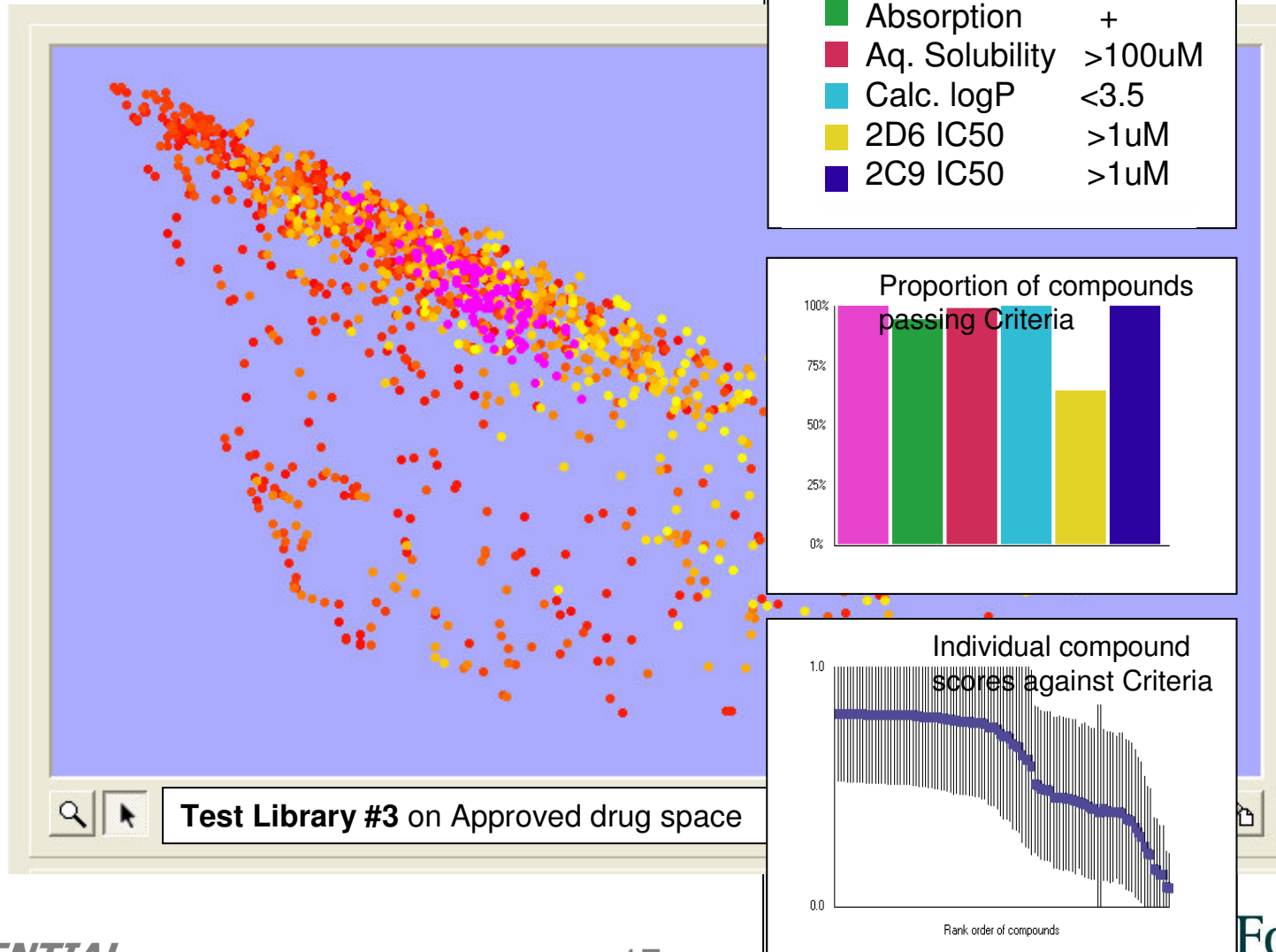


Colour-coded Rank Order in "Chemical S"



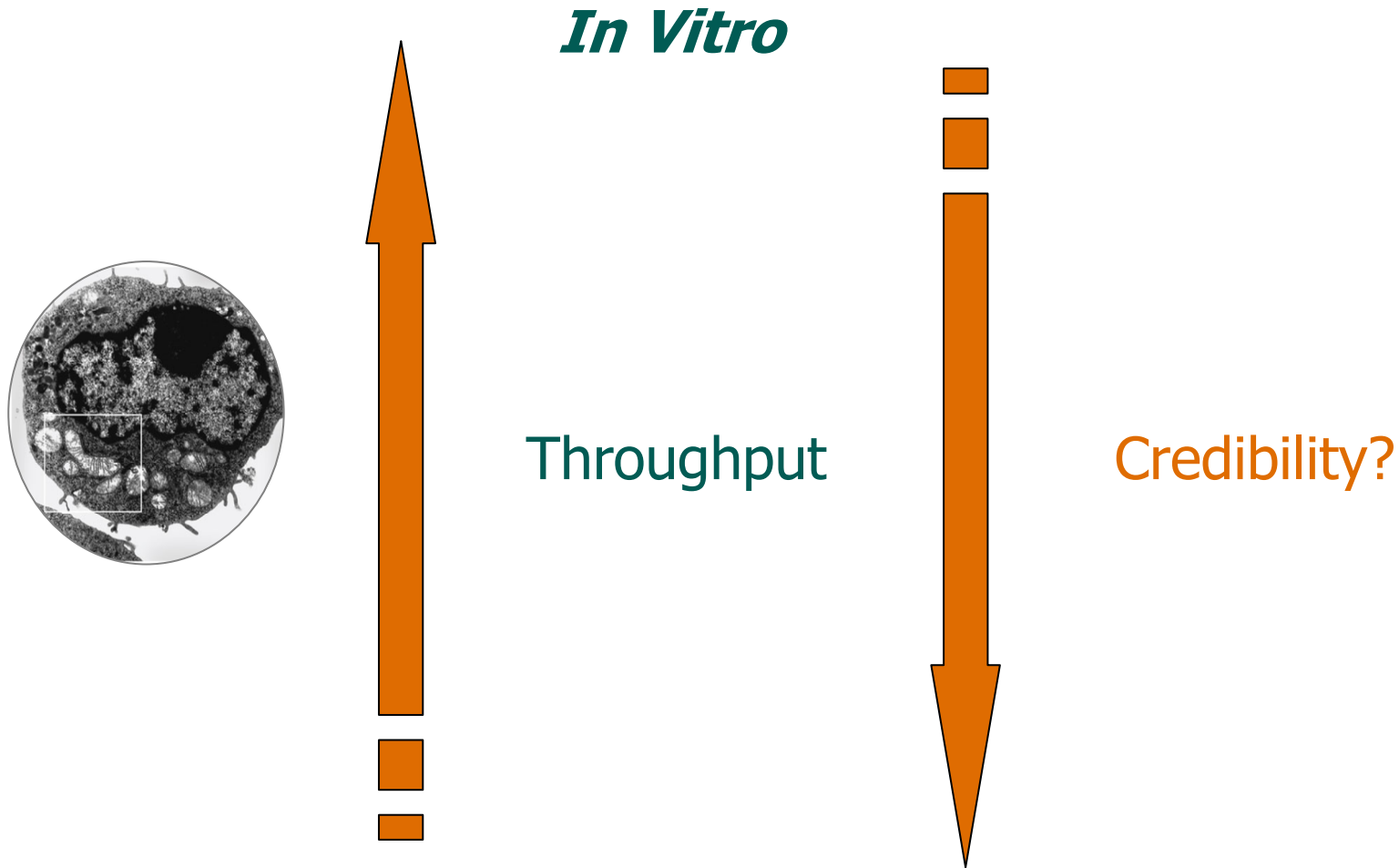


Library Design: ADME





Drug Discovery: ADME Prediction

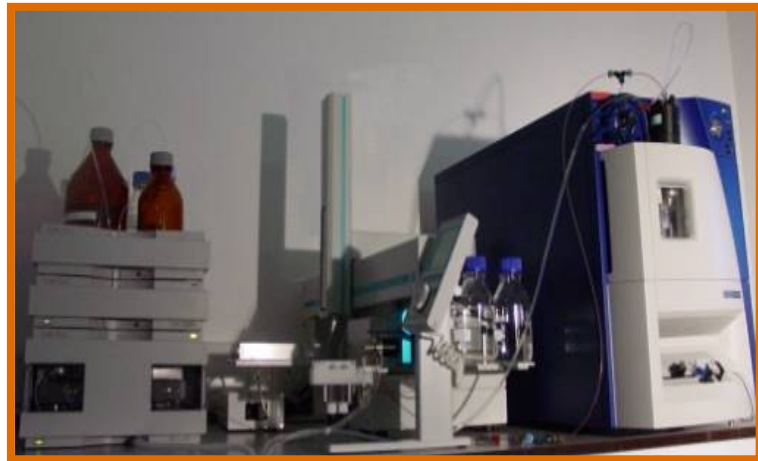




Drug Discovery: ADME Prediction

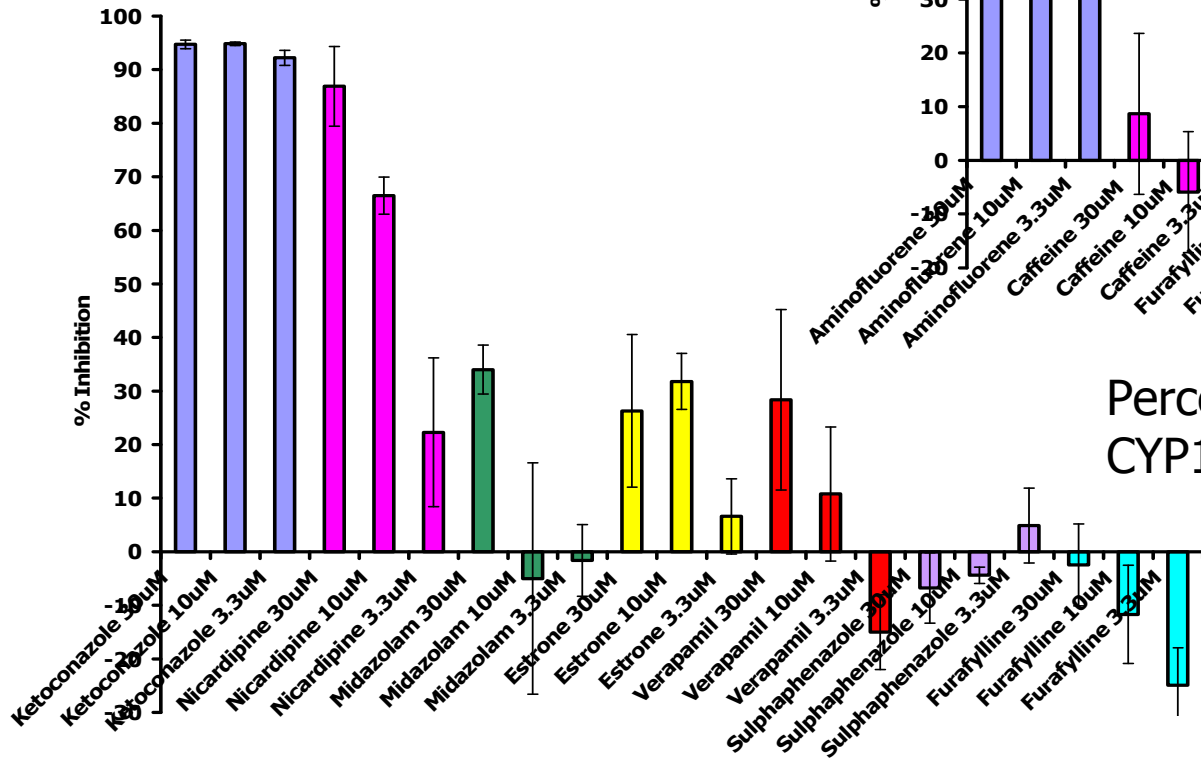
ADMEnsa Routine *In Vitro* Assays

- Solubility
- LogD
- pKa
- CHI
- PAMPA
- Plasma stability
- Plasma protein binding
- Liver microsomal stability (Phase I and Glucuronidation)
- Liver S9 metabolism
- CYP450 metabolism
- UGT metabolism
- Enzyme kinetics
- P450 inhibition
- Time-dependent inhibition
- Hepatocyte stability
- Caco-2
- P-gp ATPase activity
- hERG
- Cytotoxicity

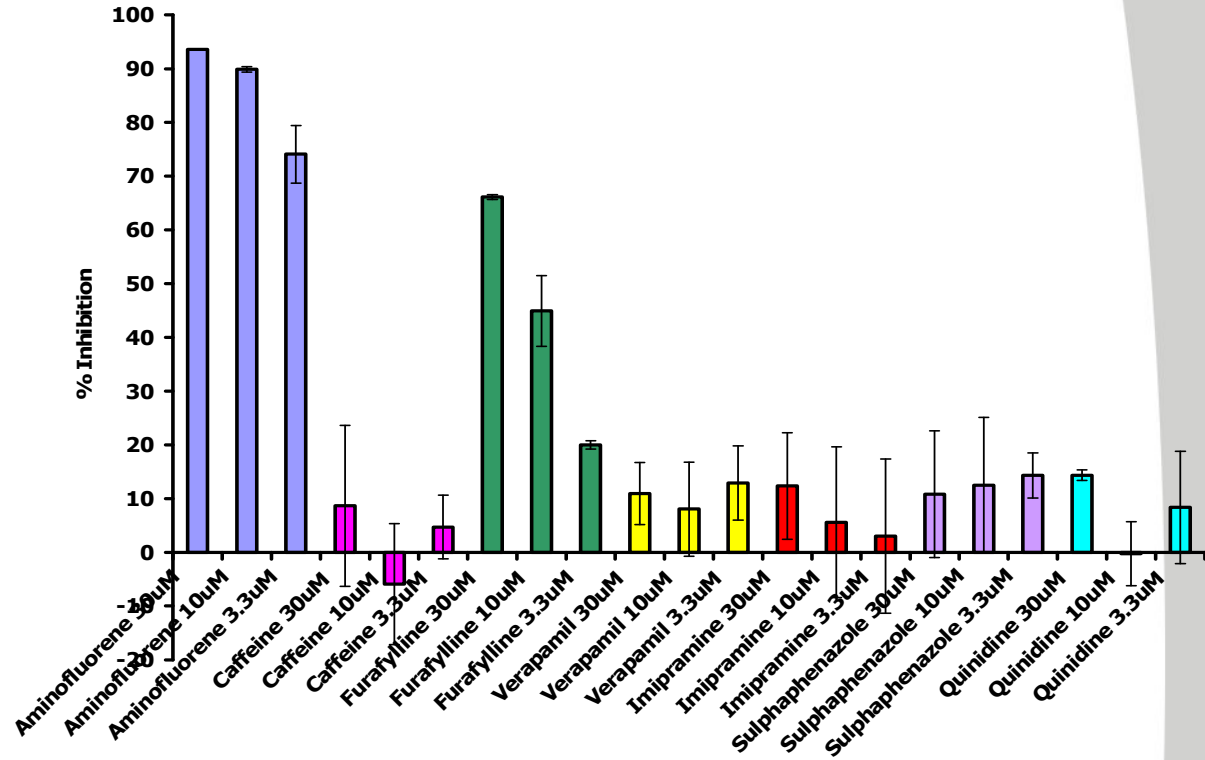




In Vitro Human P450 Inhibition



Percent inhibition and standard deviation:
CYP3A4 test set using testosterone as probe substrate

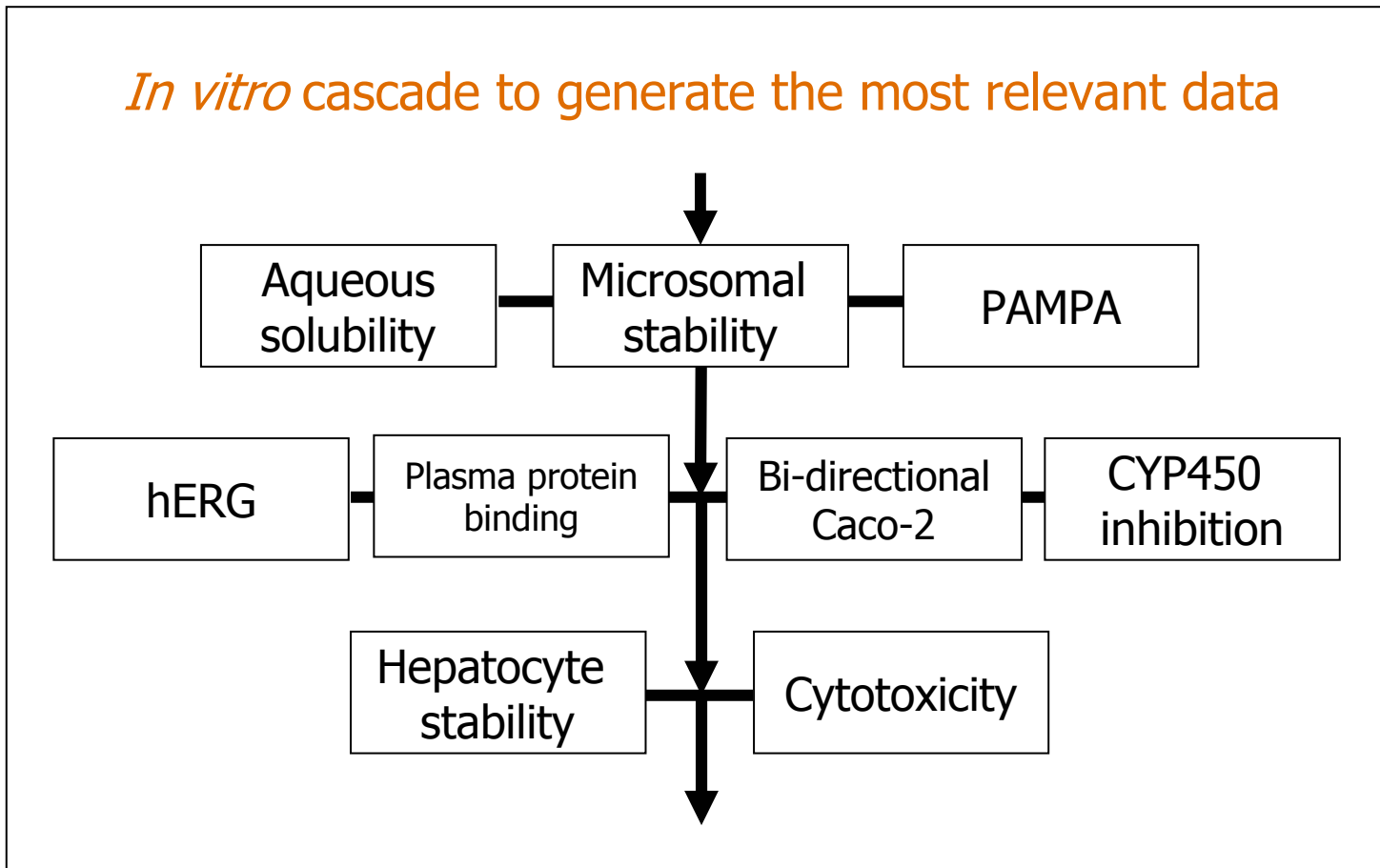


Percent inhibition and standard deviation:
CYP1A2 test set



Drug Discovery: ADME Prediction

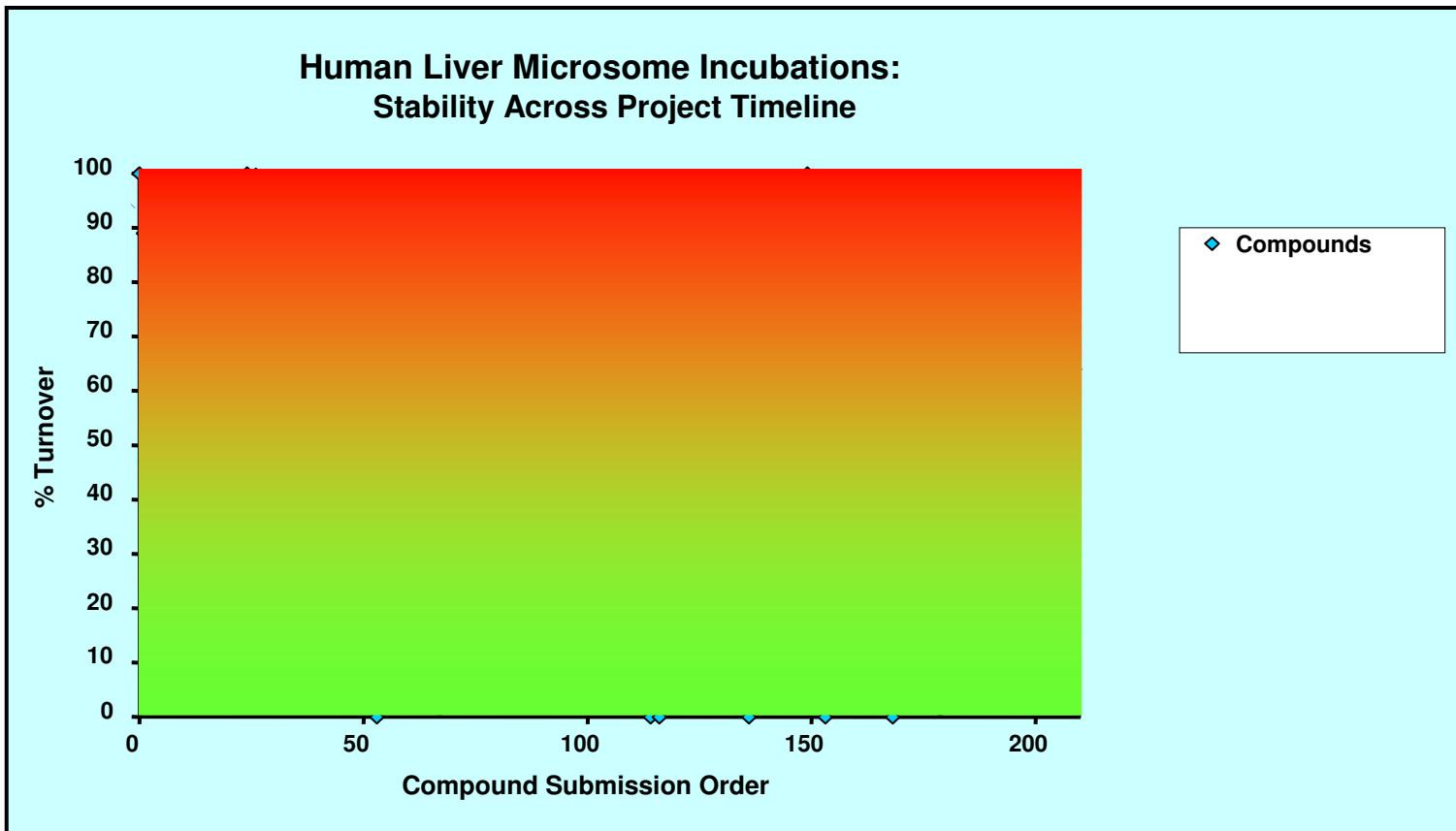
In Vitro





Drug Discovery: ADME Prediction

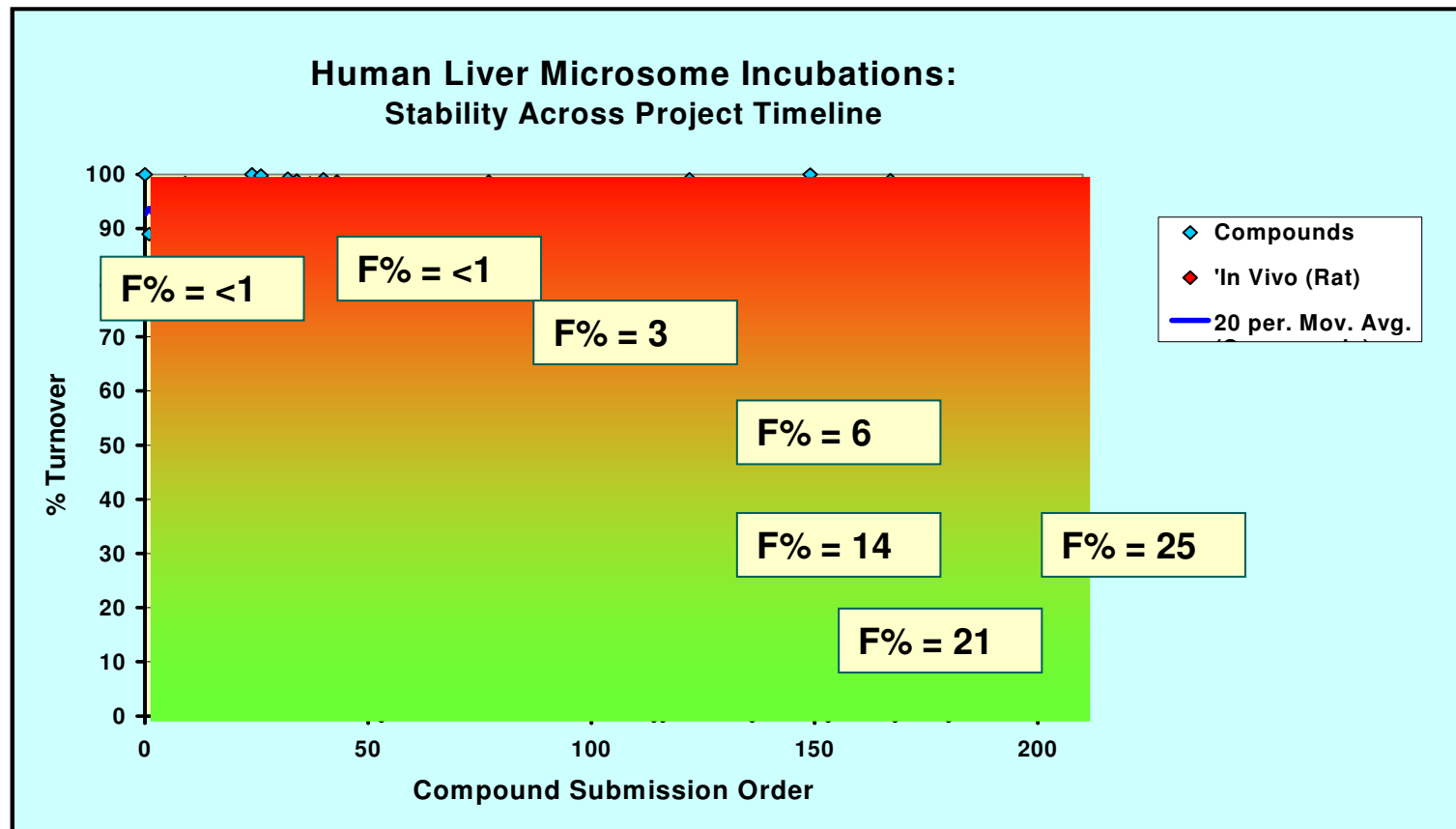
In Vitro





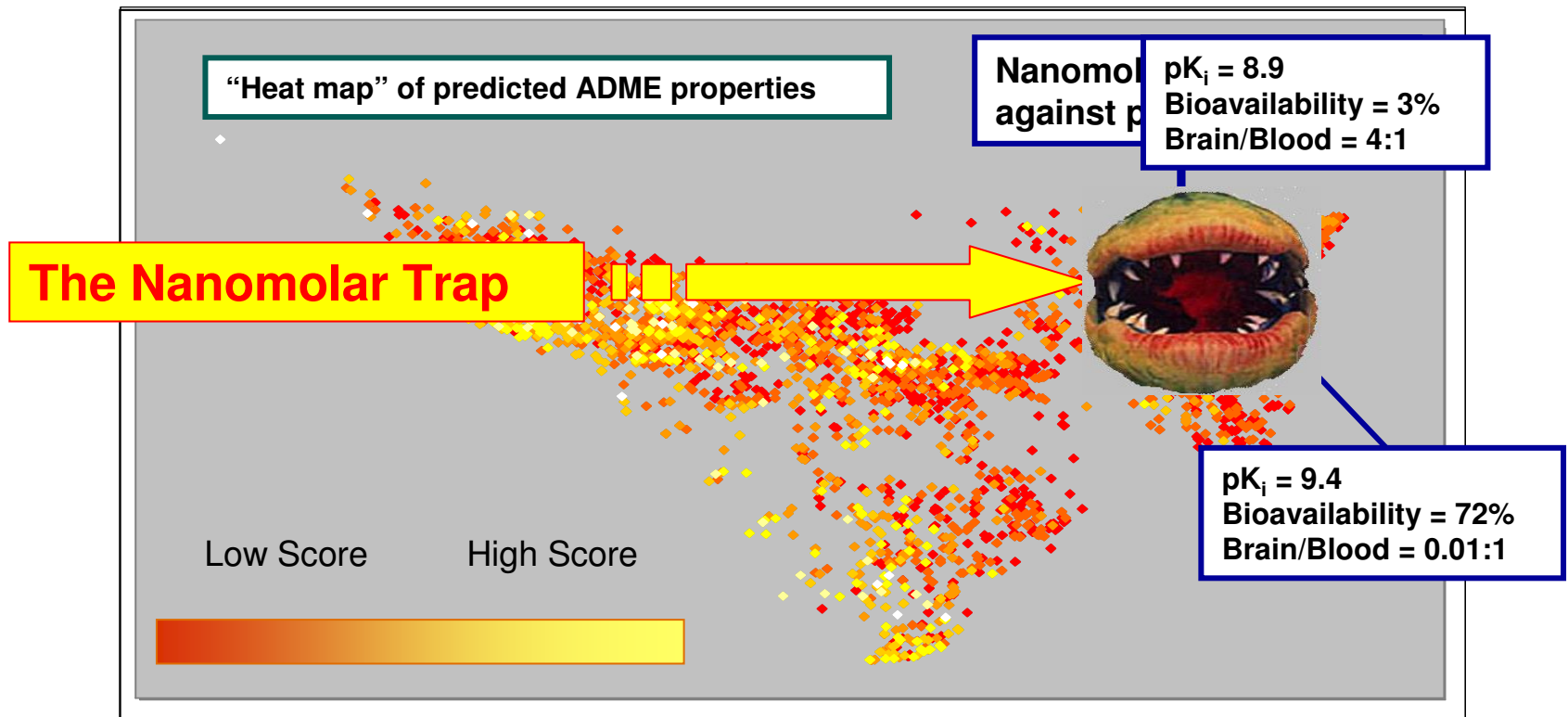
Drug Discovery: ADME Prediction

In Vitro





Screening cascade: Oral dose, CNS target





Drug Discovery: ADME Prediction

In Vitro

Score and rank compounds against Target Product Profile

User-defined scoring profile

Models Scoring Design P450 Chemical Space Selection

Current Scoring Profile: Diabetes

Property	Desired Value	Scores
LogIC50	<-0.3	Above:0.1 Below:1
logS	>1.5	Above:1 Below:0.1
HIA category	+	+:1 -:0.1
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2D6 affinity categ...	low medium	high:0.8 low:1 medium...
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Diabetes	Structure	COMPOUND_NAME	LogIC50
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0.371		2-(3-(2-(3-fluorophenylamino)propyl)phenyl)propanoic acid	-1.658
0.37		7-(N,N-dimethylsulfamoyl)-9-oxo-5,8-dihydro-2H-benzofuro[2,3-b]pyridin-2-ylidene-2,3-dihydro-1H-benzofuro[2,3-b]pyridin-2-ylidene	-0.398
0.367		5-(5-chloro-2-(pentylsulfonyl)phenyl)propanoic acid	-1.301
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User Interface: ADMEnsa Interactive™

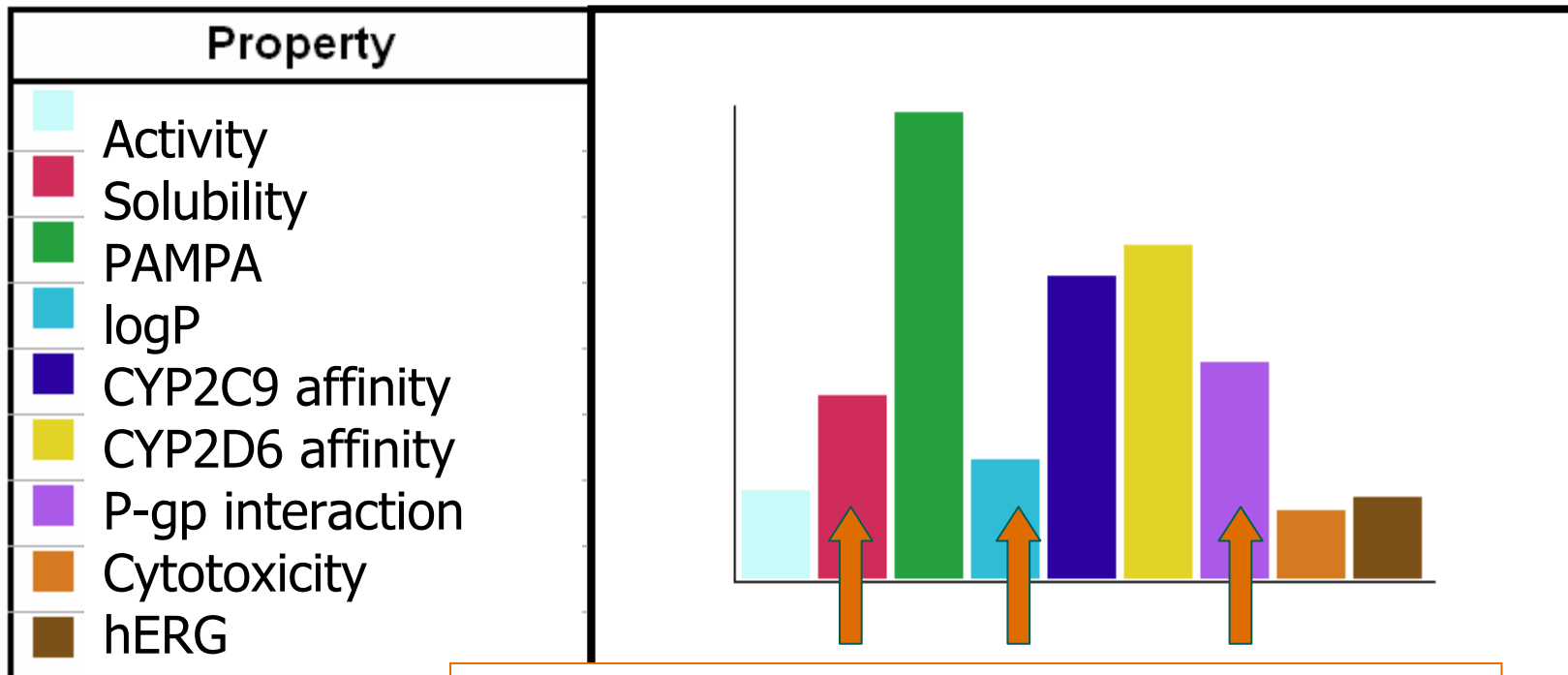
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Drug Discovery: ADME Prediction

In Vitro

Assessment of ADME risk against Target Product Profile



Risk of poor oral bioavailability?



Drug Discovery: ADME Prediction



In Vivo



Credibility?

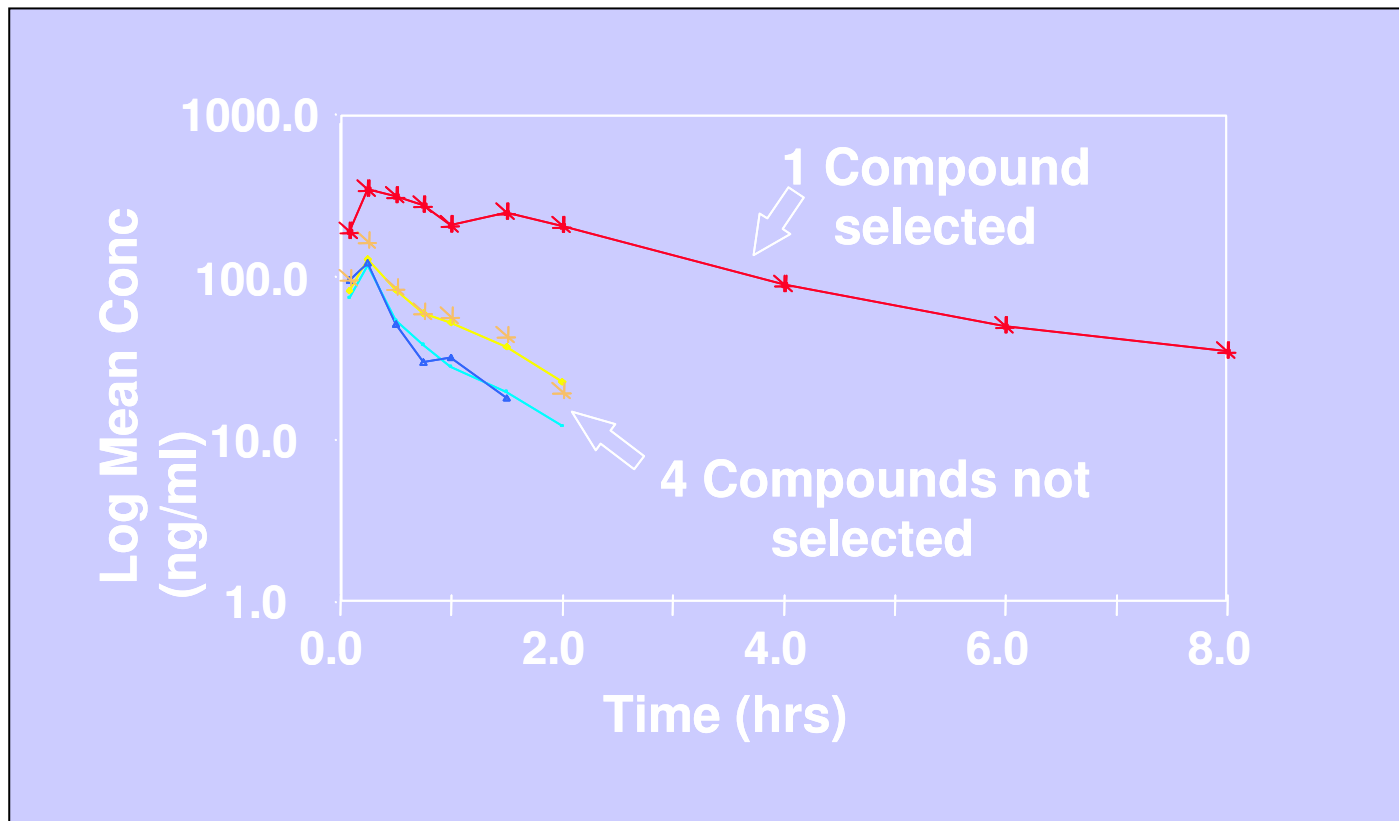
Throughput



Drug Discovery: ADME Prediction

In Vivo

Rat oral "cassette" dosing





Drug Discovery: ADME Prediction

In Vivo

LEAD MOLECULE SELECTED FOR PROGRESSION

	RAT	DOG	MAN
Cl (ml/min/kg)	40	6	8 (14)?
Vd (L/kg)	4	6	5 ?
T1/2 (min)	70	700	430 (250)?
F (%)	45	118	80?



Drug Discovery: ADME Prediction

In Vitro- In Vivo

	Half-Life (minutes)			
	Mouse	Rat	Dog	Human
Liver microsomes (1 μ M)	6	8	55	91
Hepatocytes (1 μ M)	>200	>200	>200	>200
In vivo	35	70	700	?

Oral bioavailability (%)	35	45	118	?
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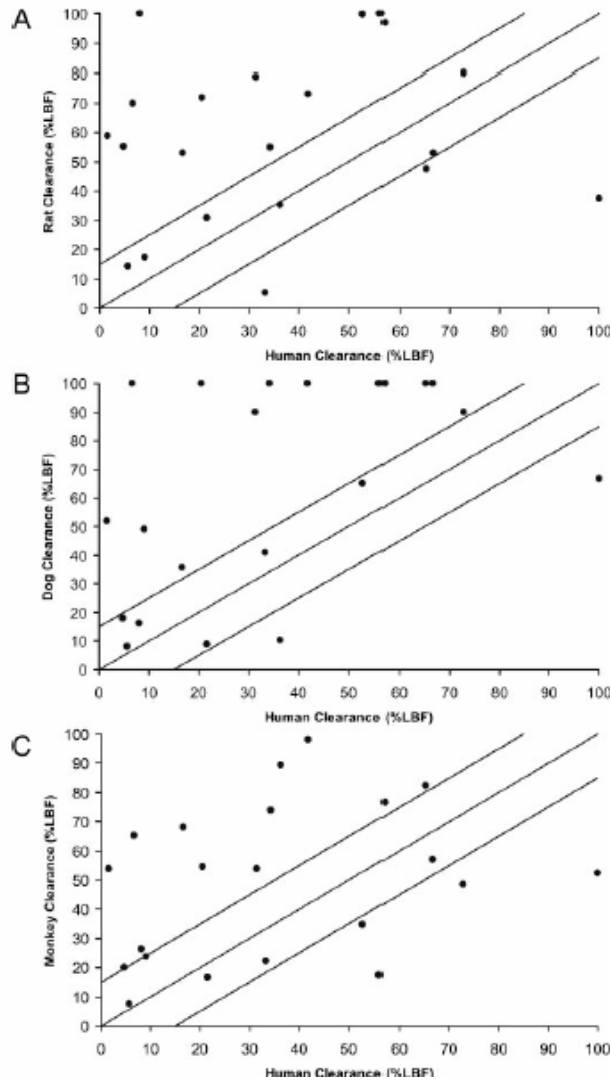


Allometric Scaling

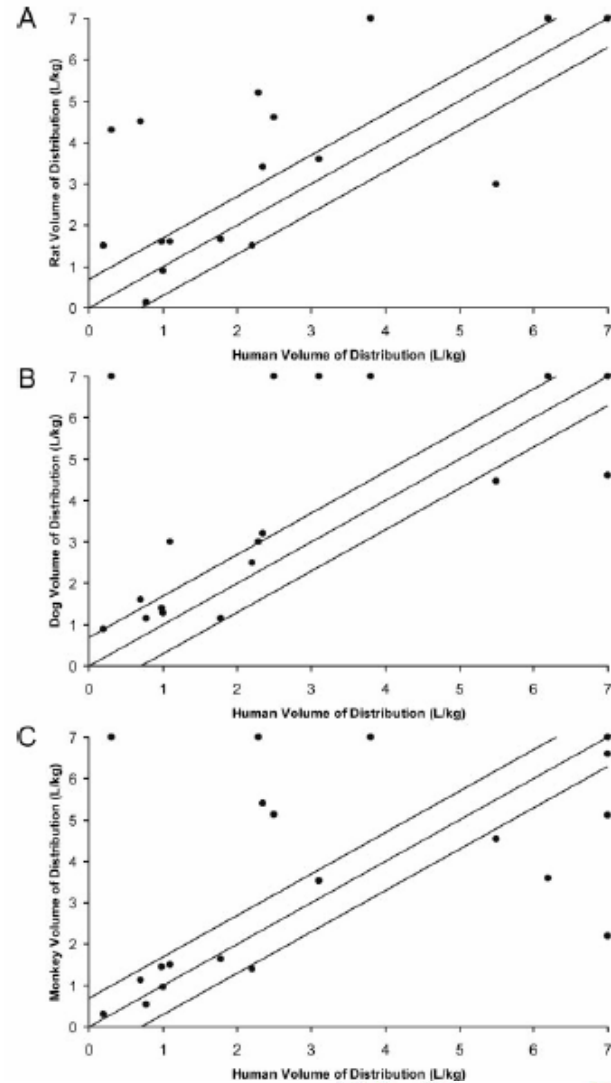
Credibility?

A = Rat
B = Dog
C = Monkey

Clearance / Liver blood flow



Volume of Distribution (L/Kg)





Drug Discovery: ADME Prediction

In Silico

- **Numbers unlimited**
- **No synthesis required**
- **Can be based on historical human data**
- **Flag potential risks for high priority lab testing**
- **Gauge the challenge of achieving the TPP**
- **Guide chemistry to "low risk" areas for TPP**
- **Why wouldn't you? (If "usual" ADME rules apply)**



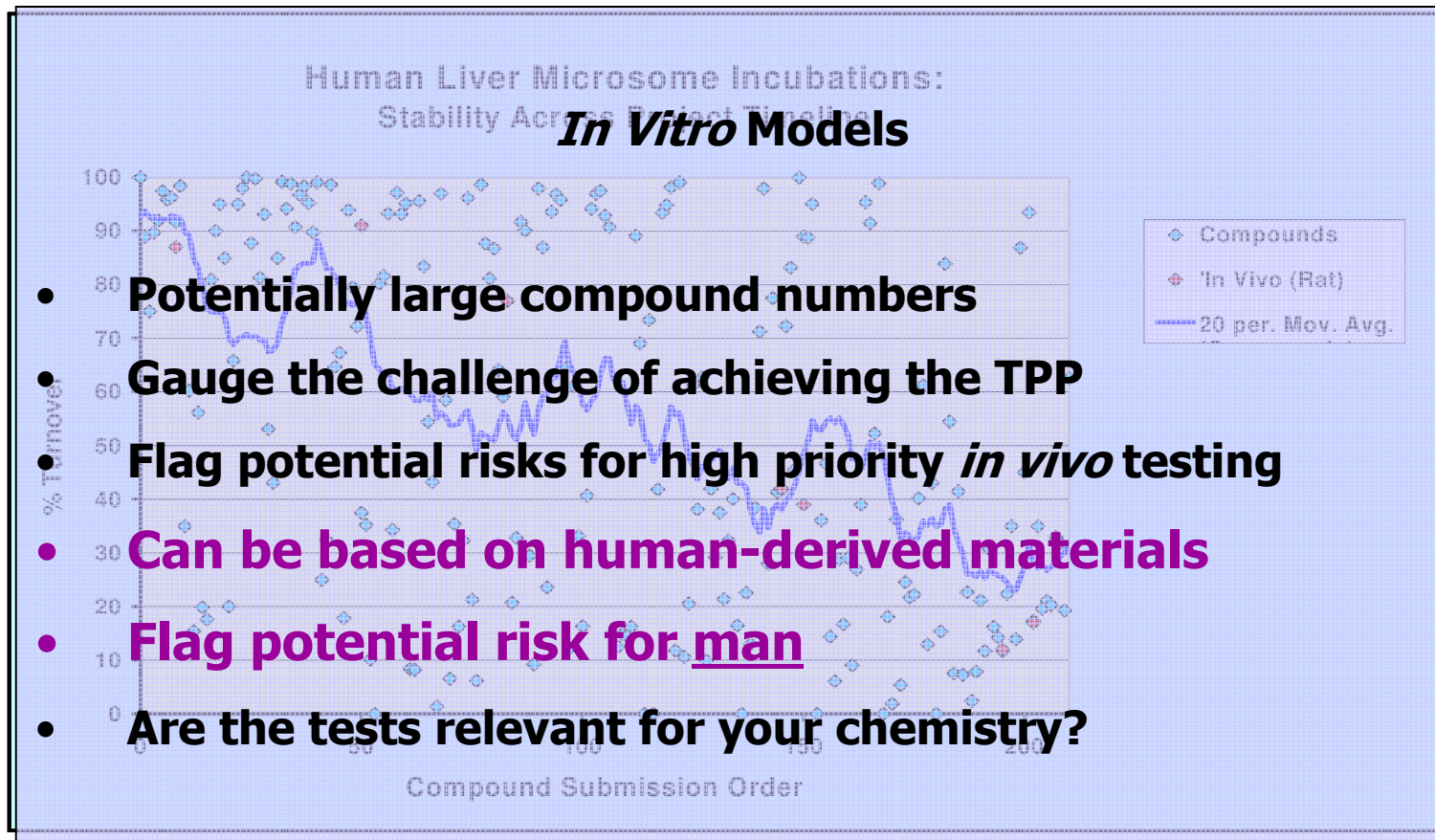
All libraries on Approved drug space





Drug Discovery: ADME Prediction

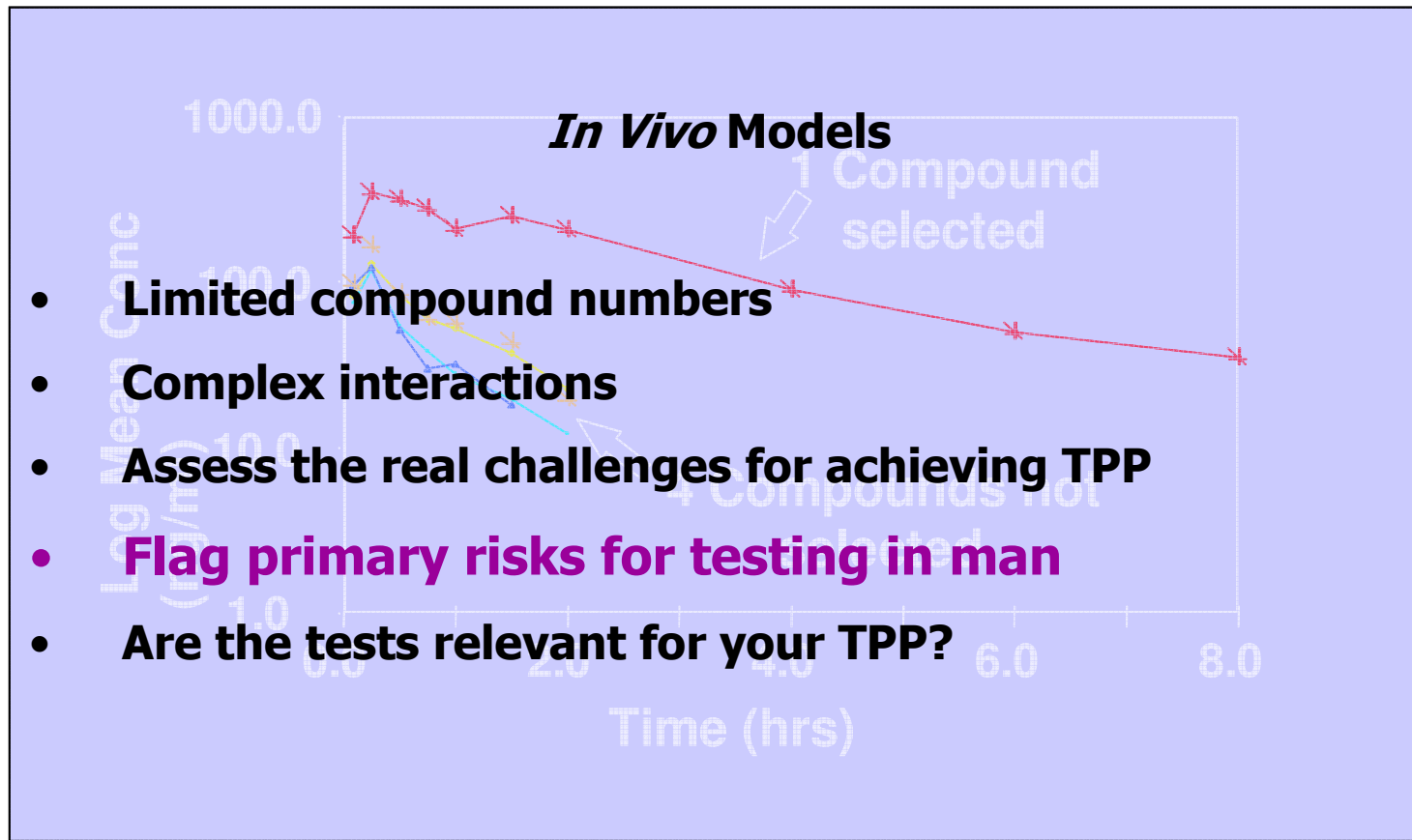
In Vitro





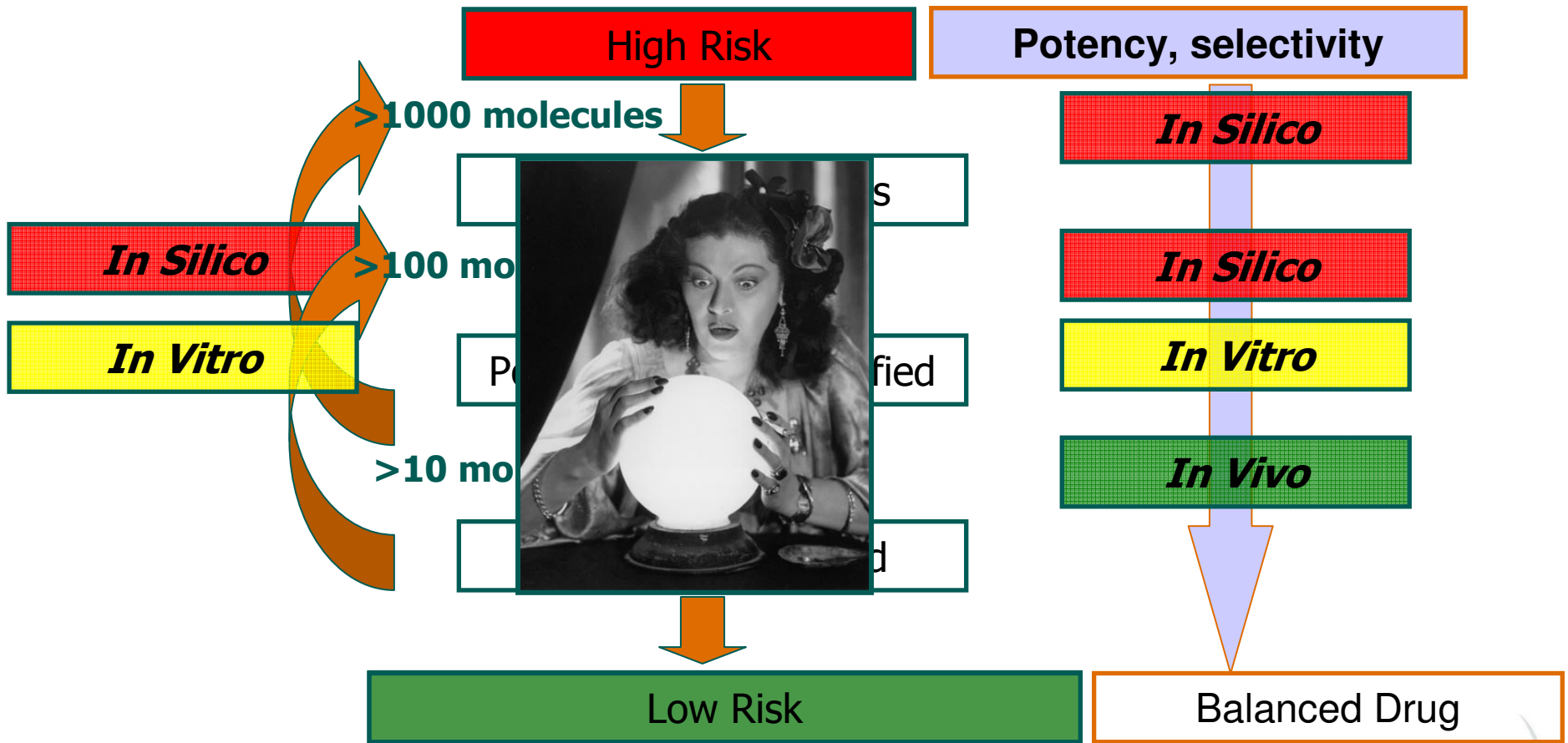
Drug Discovery: ADME Prediction

In Vivo





ADME Models in Drug Discovery





Acknowledgements:

Joelle Gola

Matt Segall

Dawn Yates

Thank You for Your Attention