#### A "kernel" for the Tropical Disease Initiative An open source approach to drug discovery



#### **Bioinformatics and Genomics Department (CIPF)**

http://bioinfo.cipf.es



### **Structural Genomics Unit**

#### Bioinformatics Department, CIPF



# TUD sterystory



#### 2004

.Steve Maurer (Berkeley) and Arti Rai (Duke) .PLoS Medicine, Dec. 2004. Vol 1(3):e56

#### 2005

.TDI web site <a href="http://TropicalDisease.org">http://TropicalDisease.org</a> .Ginger Taylor and The Synaptic Leap

#### 2006

.Maurer and Sali 41th in "50 Who Matter" .TSL web site http://TheSynapticLeap.org

#### 2008

.TDI kernel http://TropicalDisease.org/kernel

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9 Mar 2005 I'm a programmer, not a keep the list active :)	ved populat Regards, Jacob Lester <b>me where t</b>			
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	Stephen Mark Maurer			

14 Mar 2005		
I think TDI is a union for it	que and very interesting project. I 16 Feb 2005	
So, where are we I still trust in open a Luca Brivio 9 Mar 2005 I'm a programmer, not a keep the list active :) GNU started with RMS Linux started with Linu	Hello, My name is Adam Huber and I am a medical student at UNSW in Sydney Australia. I am interested in beginning research focused on tropical and infectious disease for underserved populations (A mission that seemingly matches TDI). I am, however, confused. If someone will tell me where to sign up and give me some research topics to begin on, I'd be greatful. Thank you kindly,	
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Daniel Amelang		
	Stephen Mark Maurer	

14 Mar 2005		
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I know this is chicken-eg papers or the website.	egg, but someone needs to point this out, since I haven't seen this brought up in the	
	r merging into the bios.net effort mentioned already. Together, you just might reach to take off. Consider this like when people jumped off the HURD project to come ix work.	the <b>nistic that the</b>
Daniel Amelang	Stephen Mark Maurer	

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Daniel Amelang Stephen Mark Maurer			
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### **Open Source without a Kernel?**



### Is it possible? ...

# 1. In silico drug discovery 2. Chemistry 3. Stem cell lines 4. Phase I to III trials 5. Phase IV trials

Maurer, Stephen M., "Open Source Drug Discovery: Finding a Niche (or Maybe Several) (April 2007)

# **Drug Discovery pipeline**





Adapted from: - Nwaka & Ridley. (2003) *Nature Reviews. Drug Discovery.* **2**:919 - Austin, Brady, Insel & collins. (2004) *Science.* **306**:1138

# **Drug Discovery pipeline**



# **TDI flowchart**



Wednesday, February 25, 2009

### **Non-Profit organizations**

Open-Source + Out-Source = low cost business model

Exploratory	Disco	overy	Preclinical	Clinical deve	lopment
	Lead identification	Lead optimization	Transition P	hase I Phase	II Phase III
PSAC antagonist	Dihydrofolate reductase	Novel macrolides	lsoquine (improved aminoquinoline)	OZ + PQP RBx11160/ OZ277 + piperaquine	Chlorproguanil- dapsone (Lapdap) -artesunate (CD/
<i>Pf</i> enoyl-ACP reductase (Fab i)	New dicationic molecules	4(1H)- pyridones Backups		AQ-13 new aminoquinoline	Paediatric coartem
Cyclofarnesyl sequiterpenes	Pf protein farnesyl- transferase (Pf-PFT)	Falcipain (cysteine protease)		Pyronarid artesunat	
	Next generation antimalarials	Entantio- selective 8-amino- quinolines	EuArtekin (di	hydroartemisinin–	piperaquine)
		Novel imidazolidine -diones			
	MMV active s	upport ended	MMV/GSK portf	olio 🛛 🔲 New pro	jects to be addec
	MMV active s	upport ended	MMV/GSK ports	olio 🔲 New pro	jects to be added



Munos (2006) Nature Reviews. Drug Discovery.

### Number of (new) targets?



"... of 361 new molecular entities approved by the FDA between 1989 and 2000, 76% targeted a precedented drugged domain and only 6% targeted a previously undrugged domain ..."

Class of drug target	Species	Number of molecular targets
Targets of approved drugs	Pathogen and human	324
Human genome targets of approved drugs	Human	266
Targets of approved small-molecule drugs	Pathogen and human	248
Targets of approved small-molecule drugs	Human	207
Targets of approved oral small-molecule drugs	Pathogen and human	227
Targets of approved oral small-molecule drugs	Human	186
Targets of approved therapeutic antibodies	Human	15
Targets of approved biologicals	Pathogen and human	76

#### Where are the targets from tropical diseases?

Overington et al. How many drug targets are there?. Nature reviews Drug discovery (2006) vol. 5 (12) pp. 993-6

#### Predicting binding sites in protein structure models.



# Need is High in the Tail

DALY Burden Per Disease in Developed CountriesDALY Burden Per Disease in Developing Countries



DALY is not a perfect measure of market size, but is certainly a good measure for importance.

DALYs for a disease are the sum of the years of life lost due to premature mortality (YLL) in the population and the years lost due to disability (YLD) for incident cases of the health condition. The DALY is a health gap measure that extends the concept of potential years of life lost due to premature death (PYLL) to include equivalent years of 'healthy' life lost in states of less than full health, broadly termed disability. One DALY represents the loss of one year of equivalent full health.

# Need is High in the Tail

DALY Burden Per Disease in Developed CountriesDALY Burden Per Disease in Developing Countries



DALYs for a disease are the sum of the years of life lost due to premature mortality (YLL) in the population and the years lost due to disability (YLD) for incident cases of the health condition. The DALY is a health gap measure that extends the concept of potential years of life lost due to premature death (PYLL) to include equivalent years of 'healthy' life lost in states of less than full health, broadly termed disability. One DALY represents the loss of one year of equivalent full health.

### "Unprofitable" Diseases and Global DALY (in 1000's)

Malaria*	46,486	Trichuriasis	1,006
Tetanus	7,074	Japanese encephalitis	709
Lymphatic filariasis*	5,777	Chagas Disease*	667
Syphilis	4,200	Dengue*	616
Trachoma	2,329	Onchocerciasis*	484
Leishmaniasis*	2,090	Leprosy*	199
Ascariasis	1,817	Diphtheria	185
Schistosomiasis*	1,702	Poliomyelitise	151
Trypanosomiasis*	1,525	Hookworm disease	59

Disease data taken from WHO, <u>World Health Report 2004</u>

DALY - Disability adjusted life year in 1000's.

\* Officially listed in the WHO Tropical Disease Research disease portfolio.

### DBAliv2.0 database

#### http://www.dbali.org



- ✓ Fully-automatic
- ✓ Data is kept up-to-date with PDB releases
- ✓ Tools for "on the fly" classification of families.
- ✓ Easy to navigate
- ✓ Provides tools for structure analysis

#### Does not provide a stable classification similar to that of CATH or SCOP

Pairwise structure alignments	
Last update:	October 6th, 20
Number of chains:	96,8
Number of structure-structure comparisons:*	1,748,371,8
Multiple structure alignments	
Last update:	August 1st, 20
Number of representative chains:	34,6
Number of families:	12,7

#### Uses MAMMOTH for similarity detection

- ✓ VERY FAST!!!
- Good scoring system with significance

Ortiz AR, (2002) Protein Sci. 11 pp2606 Marti-Renom et al. 2001. Bioinformatics. 17, 746

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### DBAliv2.0 database

http://www.dbali.org



Marti-Renom et al. BMC Bioinformatics (2007) Volume 8. Suppl S4

#### AnnoLyze

# Method



Ligand	Av. binding site seq. id.	Av. residue conservation	Residues in predicted binding site (size proportional to the local conservation)
MO2	59.03	0.185	48 49 52 62 63 66 67 113 116
CRY	20.00	0.111	23 29 31 37 44 48 49 63 85 94 96 103 121
80G	20.00	0.111	19 20 21 48 49 51 96 98 136
ACY	15.87	0.163	23 29 31 37 44 45 81 83 85 94 96 98 103 121 135



	Av.		
Partner	site seq. id.	Ax. residue conservation	Residues in predicted binding ste (size proportional to the local conservation)
			19 20 50 51 52 53 54 55 56 57 58 77 78 79 80
1113.1.1	23.68	0.948	81 82 83 84 85 93 95 97 99 134 135 138 142
			145



AnnoLyze

# **Scoring function**

#### Ligands

#### Partners



# Benchmark

	Number of chains
Initial set*	78,167
LigBase**	30,126
Non-redundant set***	4,948 (8,846 ligands)

\*all PDB chains larger than 30 aminoacids in length (8th of August, 2006)

\*\*annotated with at least one ligand in the LigBase database

\*\*\*not two chains can be structurally aligned within 3A, superimposing more than 75% of their Cα atoms, result in a sequence alignment with more than 30% identity, and have a length difference inferior to 50aa

	Number of chains
Initial set*	78,167
<b>πBase</b> **	30,425
Non-redundant set***	4,613 (11,641 partnerships)

\*all PDB chains larger than 30 aminoacids in length (8th of August, 2006)

\*\*annotated with at least one partner in the  $\pi$ Base database

\*\*\*not two chains can be structurally aligned within 3A, superimposing more than 75% of their Ca atoms, result in a sequence alignment with more than 30% identity, and have a length difference inferior to 50aa

#### AnnoLyze

# Sensitivity .vs. Precision

	Optimal cut-off	Sensitivity (%) Recall or TPR	Precision (%)
Ligands	30%	71.9	13.7
		Sensitivity =	$\frac{TP}{TP + FN}  \text{Precision} = \frac{TP}{TP + FP}$

#### ~90-95% of residues correctly predicted

# **Comparative docking**



# **Modeling Genomes**

data from models generated by ModPipe (Eswar, Pieper & Sali)



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# **Summary table**

models with inherited ligands

### 29,271 targets with good models, 297 inherited a ligand/substance similar to a known drug in DrugBank

	Transcripts	Modeled targets	Selected models	Inherited ligands	Similar to a drug	Drugs
C. hominis	3,886	1,614	666	197	20	13
C. parvum	3,806	1,918	742	232	24	13
L. major	8,274	3,975	1,409	478	43	20
M. leprae	1,605	1,178	893	310	25	6
M. tuberculosis	3,991	2,808	1,608	365	30	10
P. falciparum	5,363	2,599	818	284	28	13
P. vivax	5,342	2,359	822	268	24	13
T. brucei	7,793	1,530	300	138	13	6
T. cruzi	19,607	7,390	3,070	769	51	28
T. gondii	9,210	3,900	1,386	458	39	21
TOTAL	68,877	29,271	11,714	3,499	297	143

### L. major Histone deacetylase 2 + Vorinostat

Template 1t64A a human HDAC8 protein.



PDB	ED	Template	653	Model	0	Ligand	Exact	SupStr	SubStr	Similar
1c3sA	83.33/80.00	1t64A	36.00/1.47	LmjF21.0680.1.pdb	90.91/100.00	SHH	DB02546	DB02546	DB02546	DB02546



#### DB02546 Vorinostat

Small Molecule; Approved; Investigational

#### Drug categories:

Anti-Inflammatory Agents, Non-Steroidal Anticarcinogenic Agents Antineoplastic Agents Enzyme Inhibitors

#### Drug indication:

For the treatment of cutaneous manifestations in patients with cutaneous T-cell lymphoma who have progressive, persistent or recurrent disease on or following two systemic therapies.

### L. major Histone deacetylase 2 + Vorinostat

Literature

Proc. Natl. Acad. Sci. USA Vol. 93, pp. 13143–13147, November 1996 Medical Sciences

### Apicidin: A novel antiprotozoal agent that inhibits parasite histone deacetylase

(cyclic tetrapeptide/Apicomplexa/antiparasitic/malaria/coccidiosis)

Sandra J. Darkin-Rattray<sup>\*†</sup>, Anne M. Gurnett<sup>\*</sup>, Robert W. Myers<sup>\*</sup>, Paula M. Dulski<sup>\*</sup>, Tami M. Crumley<sup>\*</sup>, John J. Allocco<sup>\*</sup>, Christine Cannova<sup>\*</sup>, Peter T. Meinke<sup>‡</sup>, Steven L. Colletti<sup>‡</sup>, Maria A. Bednarek<sup>‡</sup>, Sheo B. Singh<sup>§</sup>, Michael A. Goetz<sup>§</sup>, Anne W. Dombrowski<sup>§</sup>, Jon D. Polishook<sup>§</sup>, and Dennis M. Schmatz<sup>\*</sup>

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ANTIMICROBIAL AGENTS AND CHEMOTHERAPY, Apr. 2004, p. 1435–1436 0066-4804/04/\$08.00+0 DOI: 10.1128/AAC.48.4.1435–1436.2004 Copyright © 2004, American Society for Microbiology. All Rights Reserved. Vol. 48, No. 4

#### Antimalarial and Antileishmanial Activities of Aroyl-Pyrrolyl-Hydroxyamides, a New Class of Histone Deacetylase Inhibitors

#### P. falciparum tymidylate kinase + zidovudine

#### Template 3tmkA a yeast tymidylate kinase.



PDB	C0	Template	655	Model	C.	Ligand	Exact	SupStr	SubStr	Similar
2tmkB	100.00/100.00	3tmkA	41.00/1.49	PFL2465c.2.pdb	82.61/100.00	ATM		DB00495		DB00495
		2		DB00495 Zidovud	line				ŝ	
		1		Small Molecule; Ap	pproved				HI CHARLES	CH1
1 R				Drug categories:						
				Anti-HIV Agents					1	
~				Antimetabolites						
		Va		Nucleoside and Nucleotide Reverse Transcriptase						
		ME		Inhibitors						
07				Drug indication:						
			2 ≽	For the treatm	ent of humai	n immunovi	rus (HIV)	) infection:	s.	

#### *P. falciparum* thymidylate kinase + zidovudine

#### NMR Water-LOGSY and STD experiments



Leticia Ortí, Rodrigo J. Carbajo, and Antonio Pineda-Lucena

# **TDI's kernel**

#### http://tropicaldisease.org/kernel

#### Ortí et al . "A kernel for open source drug discovery in tropical diseases". Submitted. Ortí et al . "A Kernel for the Tropical Disease Initiative". Submitted.



Wednesday, February 25, 2009

# **TDI's visitors...**

#### http://tropicaldisease.org



#### http://tropicaldisease.org/kernel



# **Acknowledgments**

http://tropicaldisease.org
http://thesynapticleap.org

#### **COMPARATIVE MODELING**

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#### FUNDING

Prince Felipe Research Center **Ministerio de Educación y Ciencia** STREP UE Grant Marie Curie Reintegration Grant MODEL ASSESSMENT Francisco Melo (CU) Alejandro Panjkovich (CU)

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Jeff Friedman (RU) James Hudsped (RU) Partho Ghosh (UCSD) Alvaro Monteiro (Cornell U) Stephen Krilis (St.George H)



Tropical Disease Initiative Stephen Maurer (UC Berkeley) Arti Rai (Duke U) Andrej Sali (UCSF) Ginger Taylor (TSL) Matthew Todd (U Sydney)

CCPR Functional Proteomics Patsy Babbitt (UCSF) Fred Cohen (UCSF) Ken Dill (UCSF) Tom Ferrin (UCSF) John Irwin (UCSF) Matt Jacobson (UCSF) Tack Kuntz (UCSF) Andrej Sali (UCSF) Brian Shoichet (UCSF) Chris Voigt (UCSF)

#### EVA

Burkhard Rost (Columbia U) Alfonso Valencia (CNB/UAM)

#### CAMP

Xavier Aviles (UAB) Hans-Peter Nester (SANOFI) Ernst Meinjohanns (ARPIDA) Boris Turk (IJS) Markus Gruetter (UE) Matthias Wilmanns (EMBL) Wolfram Bode (MPG)