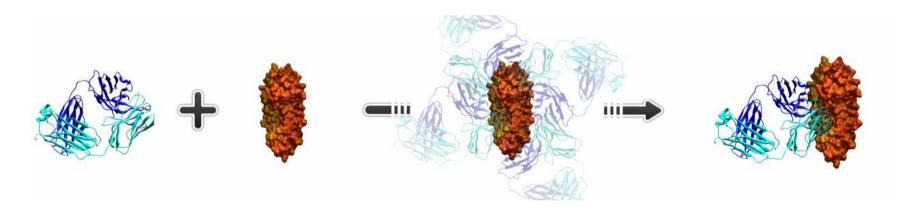
Rosetta Workshop Aug 05, 2009



Modeling antibody-antigen complexes to improve biotherapeutics



Andrea Rossi

CONFIDENTIAL

Overview



- Introduction
 - Rinat and the therapeutic antibody engineering field
 - Needs for epitope determination
 - Methods for epitope determination
- Protein-protein docking
 - The platform for protein-protein docking
 - An example success
 - Using the Amazon Cloud
 - Platform to model ab-ag complexes
- Assessing the platform
 - Ab modeling
 - Ab-ag benchmark
 - Preliminary results
- Need for experimental restraints
 - Collaboration with UCSF
 - Pepscan
 - Sidec
- Conclusion

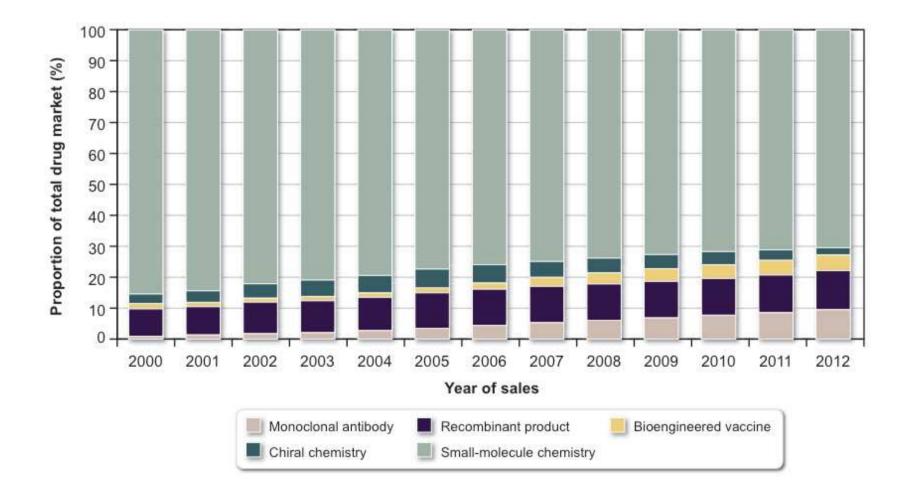
Rinat/Pfizer



- Rinat span off from Genentech in 2001 to continue the neuroscience program
- Bought by Pfizer in May 2006 for two drugs:
 - anti-NGF for acute and chronic pain and
 - anti-amiloyd beta for Alzheimer's disease.
- Currently antibodies engineering hub for Pfizer with about 80 people (mostly scientists)
- Located in South San Francisco is part of a large biotech cluster



Therapeutical antibodies market



Approved therapeutical antibodies

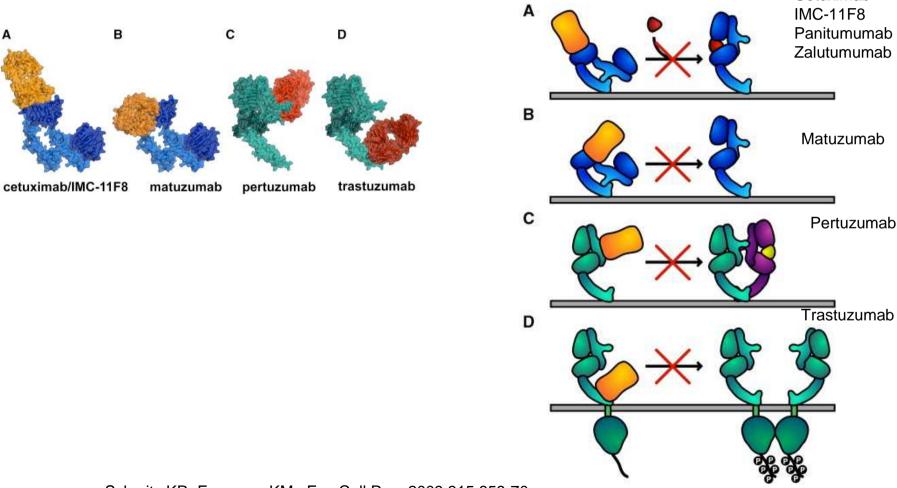


Antibody 👃	Approval date ↑	Target	Approved treatment(s) 1	Structure
Muromonab-CD3	1986 murine	T cell CD3 Receptor	Transplant rejection	NA
Abciximab	1994 chimeric	inhibition of glycoprotein IIb/IIIa	Cardiovascular disease	NA
Daclizumab	1997 humanized	IL-2Ra receptor (CD25)	Transplant rejection	NA
Rituximab	1997 chimeric	CD20	Non-Hodgkin lymphoma	NA
Basiliximab	1998 chimeric	IL-2Ra receptor (CD25)	Transplant rejection	NA
Infliximab	1998 chimeric	inhibition of TNF- α signaling	Several autoimmune disorders	NA
Palivizumab	1998 humanized	an epitope of the RSV F protein	Respiratory Syncytial Virus	NA
Trastuzumab	1998 humanized	ErbB2	Breast cancer	2004; Genentech
Gemtuzumab	2000 humanized	CD33	Acute myelogenous leukemia (with calicheamicin)	NA
Alemtuzumab	2001 humanized	CD52	Chronic lymphocytic leukemia	NA
Adalimumab	2002 human	inhibition of TNF- α signaling	Several auto-immune disorders	NA
Efalizumab	2002 humanized	CD11a	Psoriasis	2009; Chinese Academy Sciences
Ibritumomab tiuxetan	2002 murine	CD20	Non-Hodgkin lymphoma (with yttrium-90 or indium-111)	NA
Tositumomab	2003 murine	CD20	Non-Hodgkin lymphoma	NA
Bevacizumab	2004 humanized	Vascular endothelial growth factor (VEGF)	Colorectal cancer	NA
Cetuximab	2004 chimeric	epidermal growth factor receptor	Colorectal cancer, Head and neck cancer	2005; Univ Pennsilvania
Omalizumab	2004 humanized	immunoglobulin E (IgE)	mainly allergy-related asthma	NA
Natalizumab	2006 humanized	alpha-4 (α4) integrin,	Multiple sclerosis and Crohn's disease	NA
Panitumumab	2006 human	epidermal growth factor receptor	Colorectal cancer	NA
Ranibizumab	2006 humanized	Vascular endothelial growth factor A (VEGF-A)	Macular degeneration	NA
Eculizumab	2007 humanized	Complement system protein C5	Paroxysmal nocturnal hemoglobinuria	NA
Certolizumab pegol	2008 humanized	inhibition of TNF- α signaling	Crohn's disease	NA



Cetuximab

Mechanism of action: Antibodies against ErbB receptors



Schmitz KR, Ferguson KM., Exp Cell Res. 2009 315:659-70

Influenza virus: An universal epitope Α **HC19** a Hemagglutinin Neuraminidase **HC63 BH151** Viral genomic RNA and proteins Lipid layer M1 M2 **HC45 CR6261**

Ekiert DC et al., Antibody recognition of a highly conserved influenza virus epitope. Science. 2009 324:246-51

Sui J et al., Structural and functional bases for broad-spectrum neutralization of avian and human influenza A viruses. Nat Struct Mol Biol. 2009 16:265-73

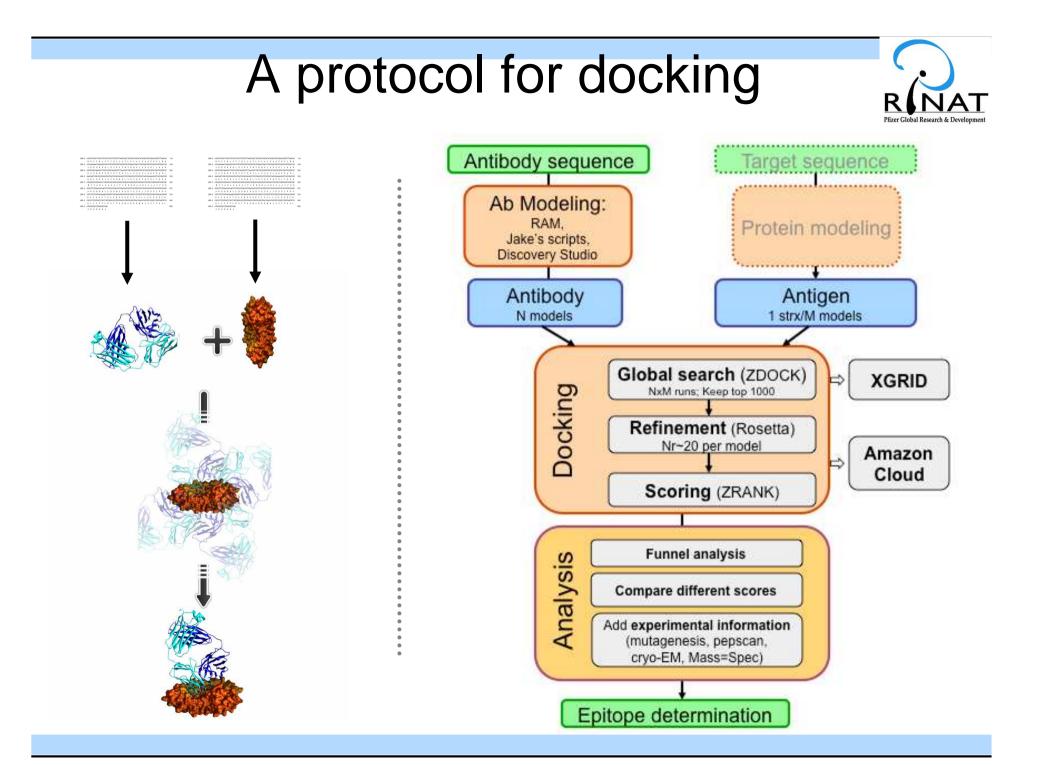


Epitope in mAb discovery

- Developing hypotheses for mechanism of action
- Strengthening intellectual property claims to efficacious molecules
- Aiding antibody selection for humanization
- Rational antibody design (humanization/optimization)
- Directing antibodies against a specific site
- In case of absence of function, study the coverage



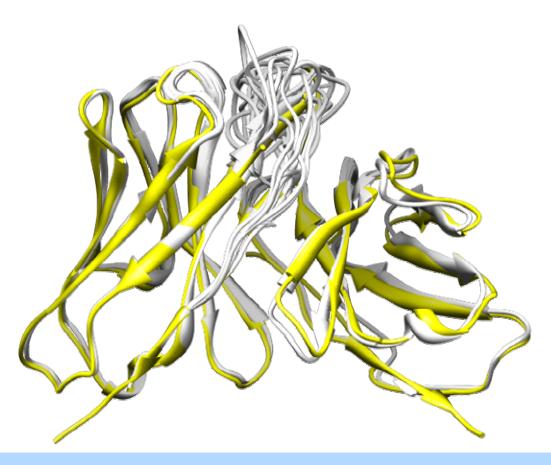
Protein docking





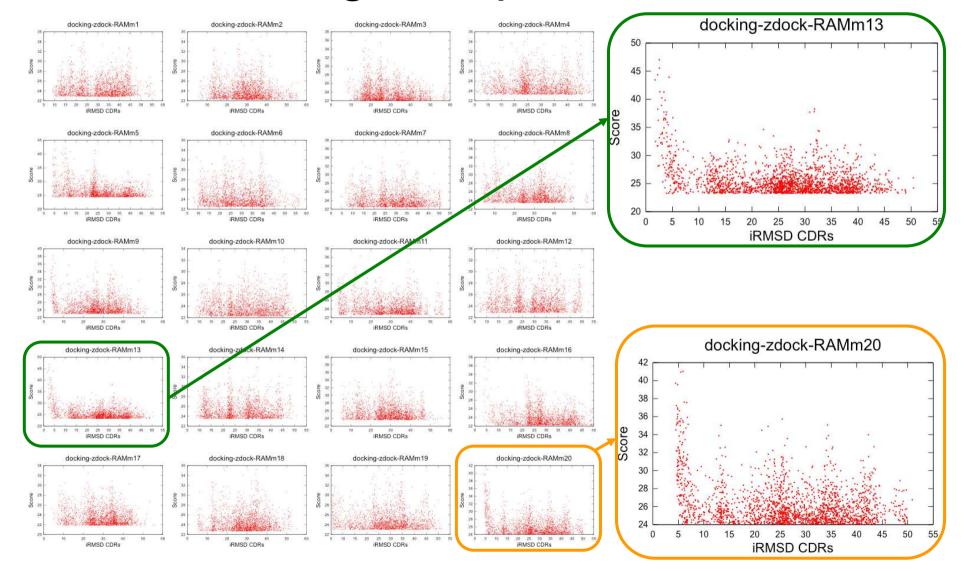
Antibody Modeling in Rosetta

- Automated generation of models
- Rosetta folding technology for H3 modeling





Docking multiple models





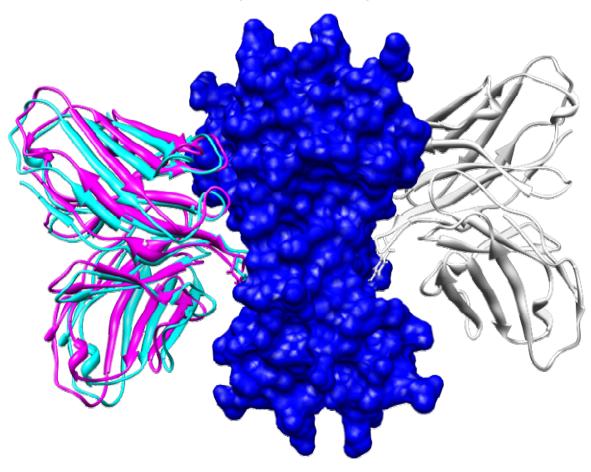
Clustering docking poses

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DOCK 2	1	3	5	3	4	3	4	1	1	5	1	3	2	1	1	1	-11					complex.8.pdb complex.15.pdb complex.18.pdb complex.7.pdb
DOCK 3	2	2		13	5	2	1	1	1	-					<u> </u>			1	Cluster #1	14 me		complex.23.pdb complex.24.pdb complex.25.pdb complex.33.pdb
DOCK 4	9	3	3	2	3	2	1	2	2			1		1		-	-11.	1				complex.34.pdb complex.35.pdb
DOCK 5	11	7	6	8	4	2	9	_			<u> </u>					-		<u> </u>				
DOCK 6	2	2	8	3	3	2	1	1	2	2	1	1	1	2	1	1						complex.2.pdb complex.3.pdb complex.4.pdb complex.9.pdb complex.10.pdb complex.12.pdb complex.14.pdb complex.17.pdb
DOCK 7	13	2	2	5	1	1	3	1	4		1	1	· ·			· ·		1	Cluster #2	15 members		complex.10.pdb complex.12.pdb complex.14.pdb complex.17.pdb complex.19.pdb complex.21.pdb complex.22.pdb complex.26.pdb
DOCK 8	2	4	10	3	4	2	4		1	1					-	-	-II.	.				complex.28.pdb complex.31.pdb complex.32.pdb
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DOCK 17	3	1	1	1	1	1	1	2	2		1	1	1	1	2	2	2	_	10 🔗 🔓	0		$\textcircled{1}{2} \textcircled{1}{2} \bullet \rule{1}{2} \bullet \rule{1}{2$
DOCK 18	1	7	4	2	2	2	4	2	5			1		1	1	1	1	_	C12	-	fx	
DOCK 19	9	6	1	2	2	3	5	1	2		· ·	3		1	1	1	1	_	A	v.	В	С
DOCK 20	-21	12	2	2	2	1	1	1	1		· ·	0	<u> </u>	· ·	· ·			_			91.72.14	complex.1.pdb complex.2.pdb complex.4.pdb complex.5.pdb
			_																Cluster	r #1	21 members	complex.18.pdb complex.13.pdb complex.14.pdb complex.17.pdb complex.18.pdb complex.13.pdb complex.14.pdb complex.17.pdb complex.24.pdb complex.20.pdb complex.22.pdb complex.23.pdb complex.33.pdb complex.34.pdb complex.35.pdb complex.39.pdb complex.42.pdb
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Docking model RAMm13

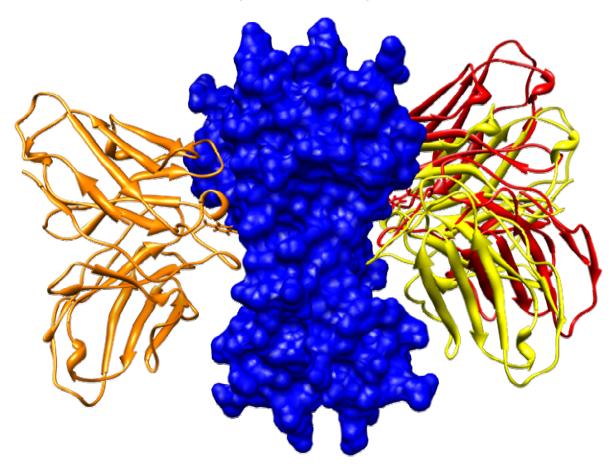
First top three complexes



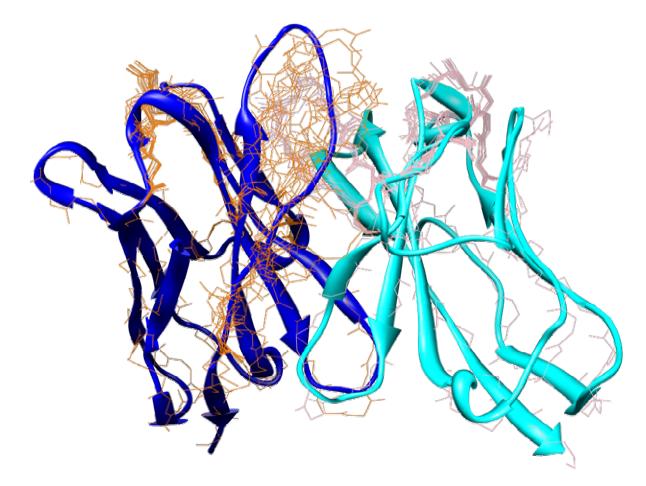


Docking model RAMm20

First top three complexes

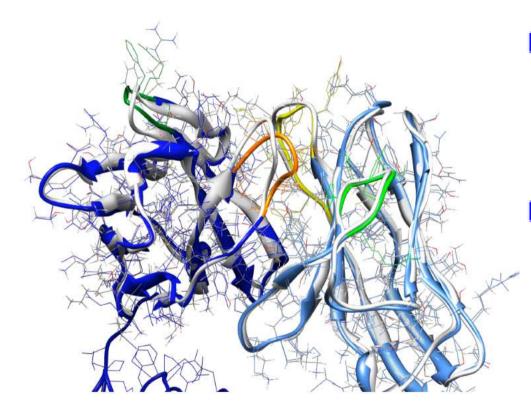


Amgen-mab1: Modeling doesn't



Pier Global Research & Development

Modeling Amgen-mab2: A successful example

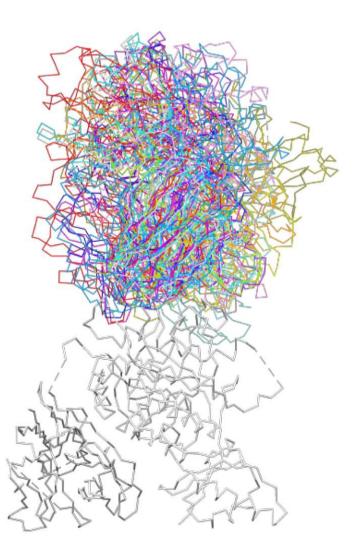


RAM top model is very close to bound Xtal structure

Are these deviations enough for docking to fail?

PCSK9-Docking mAb2 (Perturbation)

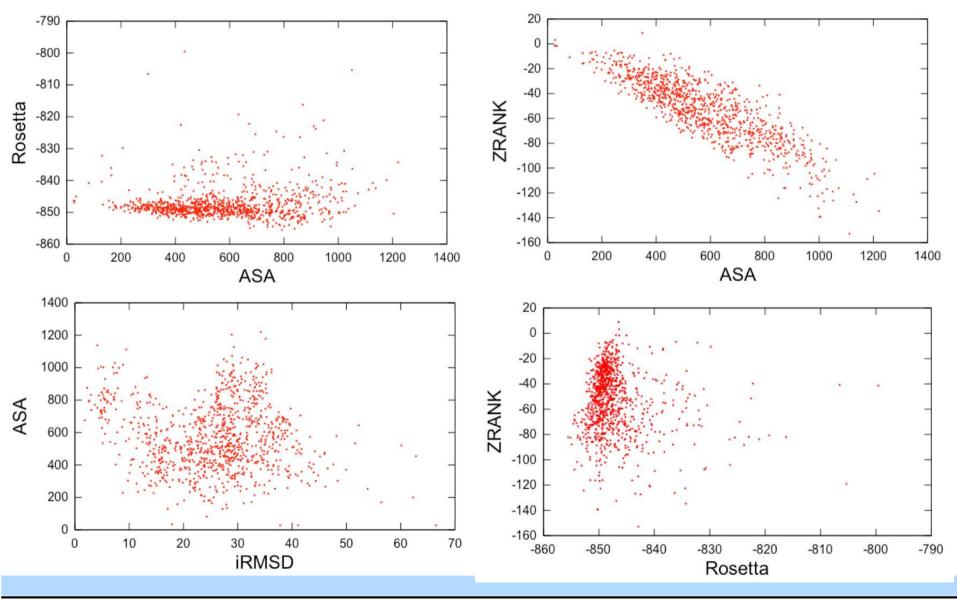




- Perturbation studies allow detailed exploration of scoring function landscape close to the native
- It allows to decompose the scoring function from the optimization protocol



Rosetta Score vs ZRANK

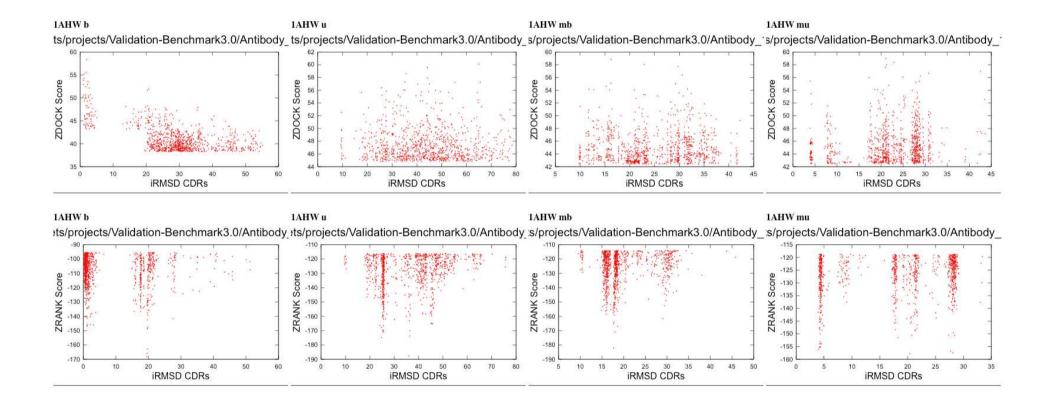




The dataset

Bound		Unbound						
		Component 1		Component	: 2			
Pdb Id Complex	Cat	Pdb1	Desc 1	Pdb2	Desc 2	RMSD	ASA	
1AHW_AB:C	А	1FGN_LH	Fab 5g9	1TFH_A	Tissue factor		0.69	1899
1BGX_HL:T	A	1AY1_HL	Fab	1CMW_A	Taq polymerase		1.48	5814
1BJ1_HL:VW	AB	1BJ1_HL	Fab	2VPF_GH	vEGF		0.5	1731
1BVK_DE:F	A	1BVL_BA	Fv Hulys11	3LZT_	HEW lysozyme		1.24	1321
1DQJ_AB:C	A	1DQQ_CD	Fab Hyhel63	3LZT_	HEW lysozyme		0.75	1765
1E6J_HL:P	A	1E60_HL	Fab	1A43_	HIV-1 capsid protein p24		1.05	1245
1FSK_BC:A	AB	1FSK_BC	Fab	1BV1_	Birch pollen antigen Bet V1		0.45	1623
1I9R_HL:ABC	AB	1I9R_HL	Fab	1ALY_ABC	Cd40 ligand		1.3	1498
1IQD_AB:C	AB	1IQD_AB	Fab	1D7P_M	Factor VIII domain C2		0.48	1976
1JPS_HL:T	А	1JPT_HL	Fab D3H44	1TFH_B	Tissue factor		0.51	1852
1K4C_AB:C	AB	1K4C_AB	Fab	1JVM_ABCD	Potassium Channel Kcsa		0.53	1601
1MLC_AB:E	A	1MLB_AB	Fab44.1	3LZT_	HEW lysozyme		0.6	1392
1NCA_HL:N	AB	1NCA_HL	Fab	7NN9_	Flu virus neuraminidase N9		0.24	1953
1NSN_HL:S	AB	1NSN_HL	Fab N10	1KDC_	Staphylococcal nuclease		0.35	1776
1QFW_HL:AB	AB	1QFW_HL	Fv	1HRP_AB	Human chorionic gonadotropin		1.31	1580
1QFW_IM:AB	AB	1QFW_IM	Fv	1HRP_AB	Human chorionic gonadotropin		0.73	1637
1VFB_AB:C	А	1VFA_AB	Fv D1.3	8LYZ_	HEW lysozyme		1.02	1383
1WEJ_HL:F	A	1QBL_HL	Fab E8	1HRC_	Cytochrome C		0.31	1177
					Plasminogen activator			
2FD6_HL:U		2FAT_HL	Plasminogen receptor Ab	_	receptor		1.07	1139
2HMI_CD:AB		2HMI_CD	Fab 28	1S6P_AB	HIV1 reverse transcriptase		2.26	1234
2JEL_HL:P	AB	2JEL_HL	Fab Jel42	1POH_	HPr		0.17	1501
2VIS_AB:C	А	1GIG_LH	Fab	2VIU_ACE	Flu virus hemagglutinin		0.8	1296

1AHW





B=Bound, U=Unbound, MU=Model Bound, MB=Model Unbound										
rossia07@chime:/tools/datasets/projects/	alidation-Benchmark3.0/Monitor									
<u>File Edit V</u> iew <u>W</u> indow <u>H</u> elp										
AHW 1.9 0.9 0.8 30 50 51 LBVK <e> 22.9 21.4 14.6 0 0 0 LFXK <e> 0.9 0.9 0.9 52 67 67 JPS <e> 0.8 0.6 0.6 19 19 20 JNCA <e> 1.3 1.3 1.2 27 29 29 WFB <e> 32.0 12.3 12.1 0 0 0 CMTB <e> 32.0 12.3 12.1 0 0 0 CMTB <e> 32.0 12.3 12.1 0 0 0 CMTB <e> 32.0 12.3 12.1 1 6 BES 23.0 12.3 12.1 0 0 0 CMTB <e> 32.0 12.3 12.1 1 6 BEGX <e> 1.5 0.8 0.8 12.2 12.3 30 JPUT< <e></e></e></e></e></e></e></e></e></e></e></e>	$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	0 3 9 24 100 1 1 1 2 100 0 0 29 58 100 0 0 2 49 100 0 0 2 49 100 0 0 0 28 100 0 0 0 24 100 0 0 0 28 100 0 0 0 12 100 -1 -1 -1 -1 -1 -1 -1 -1 -1 -1 0 0 0 14 99 -1 -1 -1 -1 -1 0 0 732 100 0 0 0 1 78 100 0 0 1 66 100 -1 -1 -1 -1 -1 1 -1								

•••••

Best RMSD in top (1,10,100) predictions

Number of models in top 100 predictions with an RMSD less than (2.5,5,10,50,100)



COMPLEX	b_zdock	b_refine	u_zdock	u_refine	mb_zdock	mb_refine	mu_zdock	mu_refine
1AHW	51	45	1	0	0	0	9	42
1BVK	0	0	1	0	2	0	1	0
1FSK	67	38	37	22	19	17	29	28
1JPS	20	45	0	0	0	0	2	2
1NCA	29	70	5	2	1	0	0	1
1VFB	0	0	2	0	0	0	0	0
2HMI	0	-1	0	-1	-1	-1	-1	-1
2VIS	6	-1	0	-1	-1	-1	-1	-1
1BGX	23	-1	-1	-1	0	0	0	0
1DQJ	30	-1	0	-1	-1	-1	-1	-1
119R	0	0	0	0	-1	-1	-1	-1
1K4C	52	65	0	0	0	0	0	0
1NSN	8	6	0	0	-1	-1	-1	-1
1WEJ	20	24	1	0	7	6	7	2
2JEL	28	-1	2	0	6	1	1	0
1BJ1	45	48	1	-1	2	0	1	0
1E6J	6	-1	0	-1	-1	-1	-1	-1
HQD	47	63	0	0	-1	-1	-1	-1
1MLC	30	55	5	0	-1	-1	-1	-1
1QFW	9	-1	1	-1	0	0	0	0
2FD6	39	57	0	0	-1	-1	-1	-1
2QFW	9	-1	0	0	-1	-1	-1	-1

Number of top 100 structures below 10.0A from native



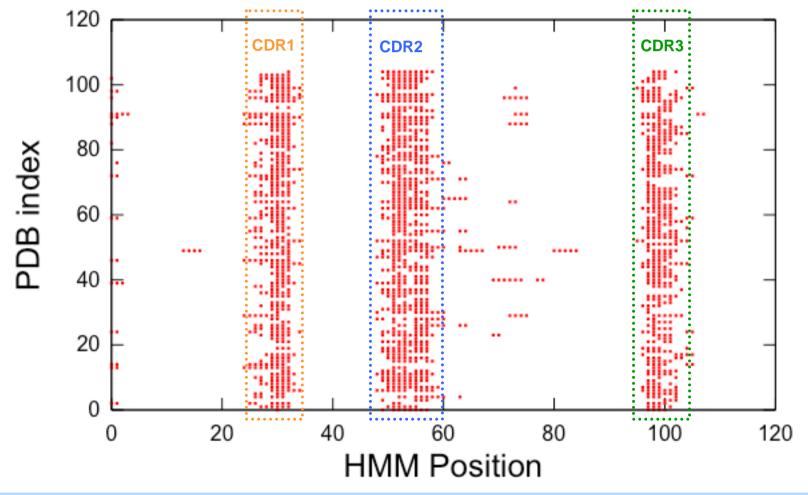
COMPLEX	b_zdock	b_refine	u_zdock	u_refine	mb_zdock	mb_refine	mu_zdock	mu_refine
1AHW	0.9	1.0	25.8	24.8	11.8	16.0	3.9	4.1
1BVK	21.4	20.2	16.2	19.7	11.3	25.1	23.1	23.4
1FSK	0.9	21.5	1.9	2.0	6.6	7.8	7.0	7.7
1JPS	0.8	0.6	31.8	28.9	24.9	25.8	8.8	14.1
1NCA	1.3	0.9	19.8	20.9	12.2	13.8	12.1	17.9
1VFB	12.3	23.2	17.2	20.0	13.9	18.2	19.9	24.3
2HMI	19.3	-1.0	58.6	-1.0	-1.0	-1.0	-1.0	-1.0
2VIS	25.7	-1.0	42.1	-1.0	-1.0	-1.0	-1.0	-1.0
1BGX	0.8	-1.0	-1.0	-1.0	53.2	46.5	18.6	18.3
1DQJ	1.0	-1.0	26.1	-1.0	-1.0	-1.0	-1.0	-1.0
119R	25.2	24.4	56.5	51.5	-1.0	-1.0	-1.0	-1.0
1K4C	1.0	31.2	31.2	32.6	32.0	33.7	16.8	24.4
1NSN	15.8	28.5	26.2	36.6	-1.0	-1.0	-1.0	-1.0
1WEJ	0.9	29.3	26.9	18.4	16.8	6.1	11.6	15.7
2JEL	5.3	-1.0	0.0	34.2	7.9	14.7	6.5	17.6
1BJ1	0.8	0.6	25.5	-1.0	13.5	14.0	9.6	14.7
1E6J	21.5	-1.0	49.5	-1.0	-1.0	-1.0	-1.0	-1.0
1IQD	0.8	0.8	31.1	28.6	-1.0	-1.0	-1.0	-1.0
1MLC	0.9	0.9	22.3	26.6	-1.0	-1.0	-1.0	-1.0
1QFW	1.3	-1.0	18.1	-1.0	32.6	20.7	32.8	16.7
2FD6	7.6	6.8	34.2	34.5	-1.0	-1.0	-1.0	-1.0
2QFW	1.3	-1.0	14.9	28.3	-1.0	-1.0	-1.0	-1.0

Min RMSD from native among top 10 conformations

Blocking VH



Pfizer Global Research & Dev

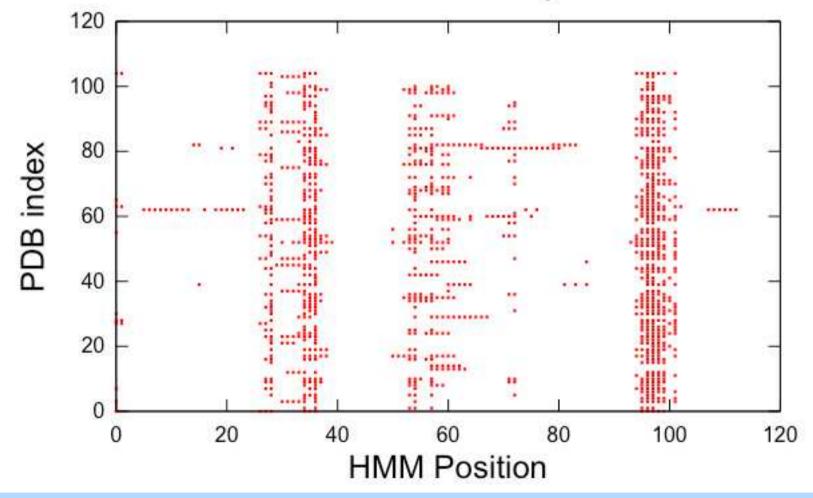


Blocking VL

VJK.heatmap

R

Pfizer Global Research & Developmer



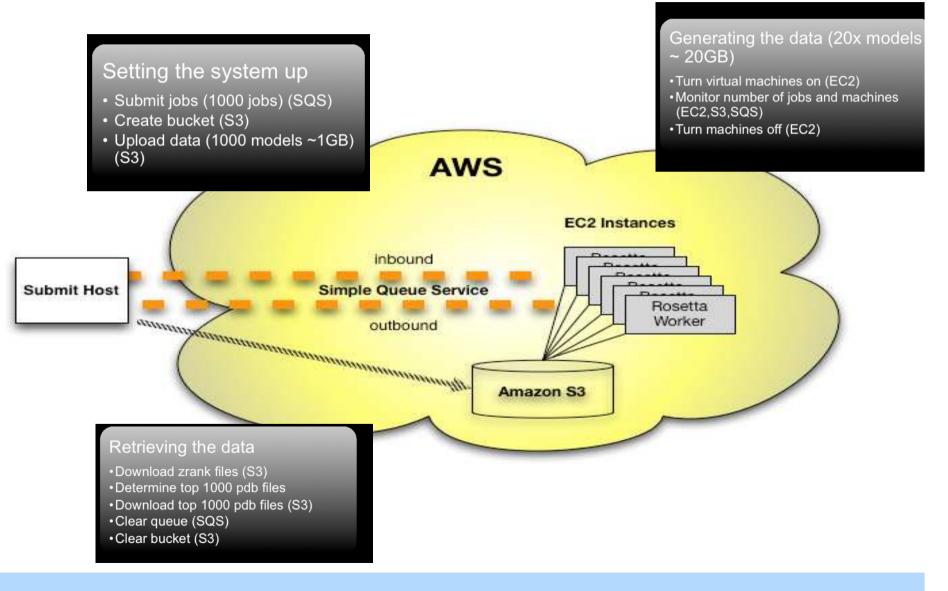


Resources

Name	Location	Software	CPUs	Disk	Pros	Cons
Clinical Grid	Groton	LSF	256?	Local	Available unless clinical trials	Difficult to install software; difficult to mount external hard drives
CamBlade (IBM)	Rinat+Cam bridge	LSF	~20+40	Mount (local/rem ote)	Easy to install; available	Remote master is slow in writing on disk; remote slaves are extremely slow because limits in I/O.
Apple Grid	Rinat	XGRID	72 (powerful)	Mount (local)	Fast machines; lots of diskpace; easy to install;	Need to recompile most software;
Amazon Cloud	Distributed	SQS,S3,EC 2,SimpleDB	~500	Distributed	Pay what you use – you built your cluster on the fly; virtual machines allows easy installation of virtually any software	Different paradigm - requires additional training (Bioteam); Not designed for scientific computing; Requires set of scripts to access the infromation



Amazon Cloud (Refinement)

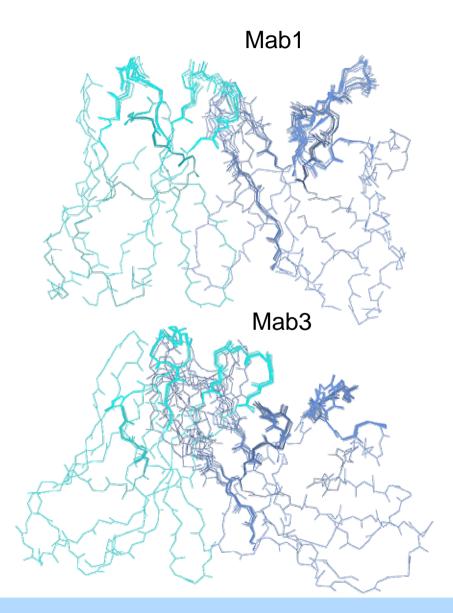


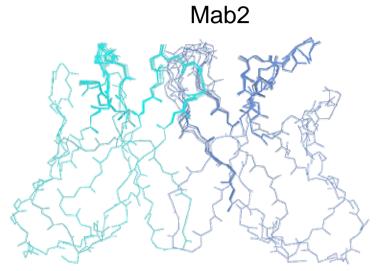


Partial conclusions

- Ab modeling + global docking is in general not a viable choice
- Continuous improvement in the software RosettaAntibody, EnsembleDock, SnugDock
- We can leverage from biacore studies (in particular epitope binning)
- Experimental information

Docking multiple antibodies



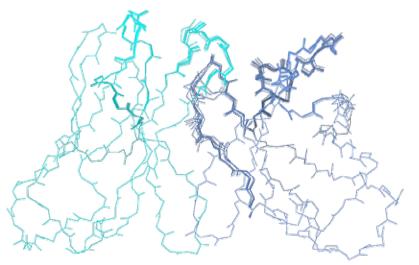




R

Pfizer Global

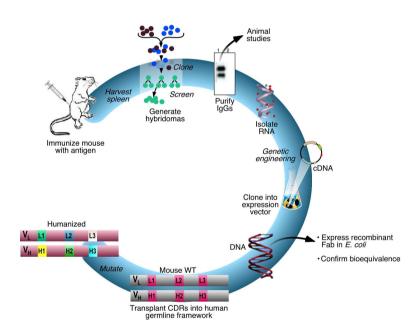
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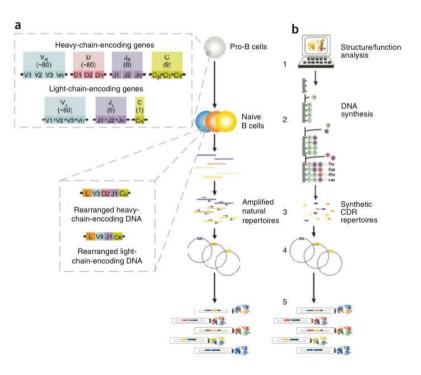


How do antibodies get "discovered"?

Hybridoma technology



Display libraries Synthetic libraries Human libraries Naïve libraries

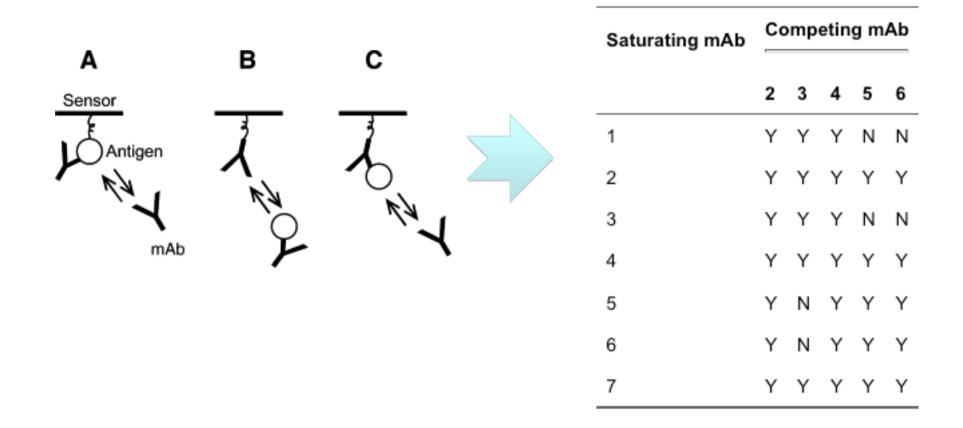


Methods for epitope determination

Method	Time	Res.	Unc.	M. Abs	Pros	Cons
Peptides	~1 m	Low	Low	Yes	Fast and reliable	Linear epitopes only
Mass-spec (i.e., H/D exchange, chem. mod., e.g. ExSAR)	~3- 6mon ths	Low	Medium	Yes/No	Reasonably fast; potentiality for improvement	Requires data interpretation
Conf restrained peptides (e.g., Pepscan)	~2 ms	Low	High	Yes	Extends previous method - Potentially works for any type of binding site	High degree of uncertainty
Mutagenesis	~3mo nths	Low	Medium	Yes	General approach Provides detailed binding information	Time consuming; Need data interpretation
X-Ray	6- 12mo nths	Highest	None	No	The gold standard	Requires crystallization; Present a static image of the complex
SAXS	1mon th	M/H	Medium	Yes	Doesn't require crystallization; can process multiple abs	Doesn't work for flexible molecules; requires data interpretation
NMR	3- 12mt	High	Low	Yes/No		
Electron Microscopy	3- 9mon ths	Lowest	Low	No	No need to crystallize; single particles; capture flexibility of the complex	Expensive; needs further development
Protein-protein docking	1wee k	Highest	High	Yes	Superfast and high resolution if enough computer power available; provides additional information of the interaction; allows processing multiple abs	Success depends on correctly modeling individual components; force field not accurate enough for certain interactions (water)



Binning mabs by SPR

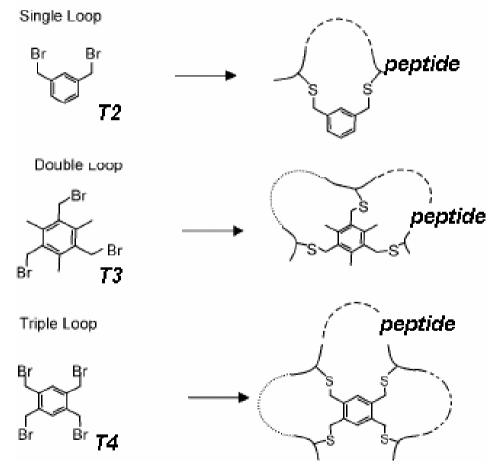


Peptide scanning: beyond linear epitopes



Basis of the CLIPS technology

spacially defined peptides to mimic complex protein structures.



CLIPS, Chemically Linked Peptides on Scaffolds.



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