



## High-Performance Computing: the example of Merck Serono

Friedrich Rippmann, Bio- and Chemoinformatics  
rippmann@merck.de

# Introducing Merck Serono



- Merck is the oldest pharmaceutical and chemical company in the world
- Establishment of the new Merck Serono division in early 2007 following the acquisition of Serono S.A. by Merck; division now headquartered in Geneva
- Focus on innovative, prescription drugs of chemical and biological origin
- Major research sites in Darmstadt, Geneva and Boston
- R&D Investment: € 1 billion (2008)
- R&D FTEs: 2300
- >100 clinical trials ongoing
- over 150 active external collaborations (former Research)



The Pützer Tower and Pyramid  
at Darmstadt Merck  
headquarters



Merck Serono headquarters in  
Geneva

# HPC at Merck, Merck Serono



Awareness phase	Test & establ. phase	Production phase
1991	1996	2001
CONVAX (in-house)	Specialized HW (external) e.g. Parsytec [PC Cluster (internal)]	IBM & SGI clusters & multiprocessor machines
calculation speed	calculation speed	calculation & storage sp.
limited in-house activity	academic collaborations: MAXHOM, PHASE, TTN, TARGID...	all in-house
molecular dynamics	sequence annotation, docking, structure prediction	sequence annotation, docking, genome-wide association studies, large-scale clustering
low project impact	low project impact	good project impact

# HPC – external or internal?



	<p>External</p> <ul style="list-style-type: none"><li>- up-to-date hardware</li><li>- on demand (potentially lower cost)</li><li>- (almost) unlimited capacity</li></ul>	<p>Internal <i>retained option (for now)</i></p> <ul style="list-style-type: none"><li>- safe</li><li>- <del>flexible (you install &amp; run whatever software whenever you need it)</del></li></ul>
pro		
con	<ul style="list-style-type: none"><li>- Software installation</li><li>- Data transmission</li><li>- <b>Security</b>: what happens if service leaks (academia), or commercial service providers goes bankrupt (and your data are sold together with the machines...)?</li></ul>	<ul style="list-style-type: none"><li>- high investment, maintenance</li><li>- know-how intensive (load balancing systems, memory allocation etc.)</li></ul>

# Application „sequence annotation“



- Various tasks (early application: GENEQUIZ (1996); today e.g. re-annotation of Affymetrics probe sets)
- Typical run times: days to weeks
- Software used: e.g. BLAST, in-house SW
- Issues: data volumes, storage speed
- Project impact: medium (must be done, but no immediate discovery)

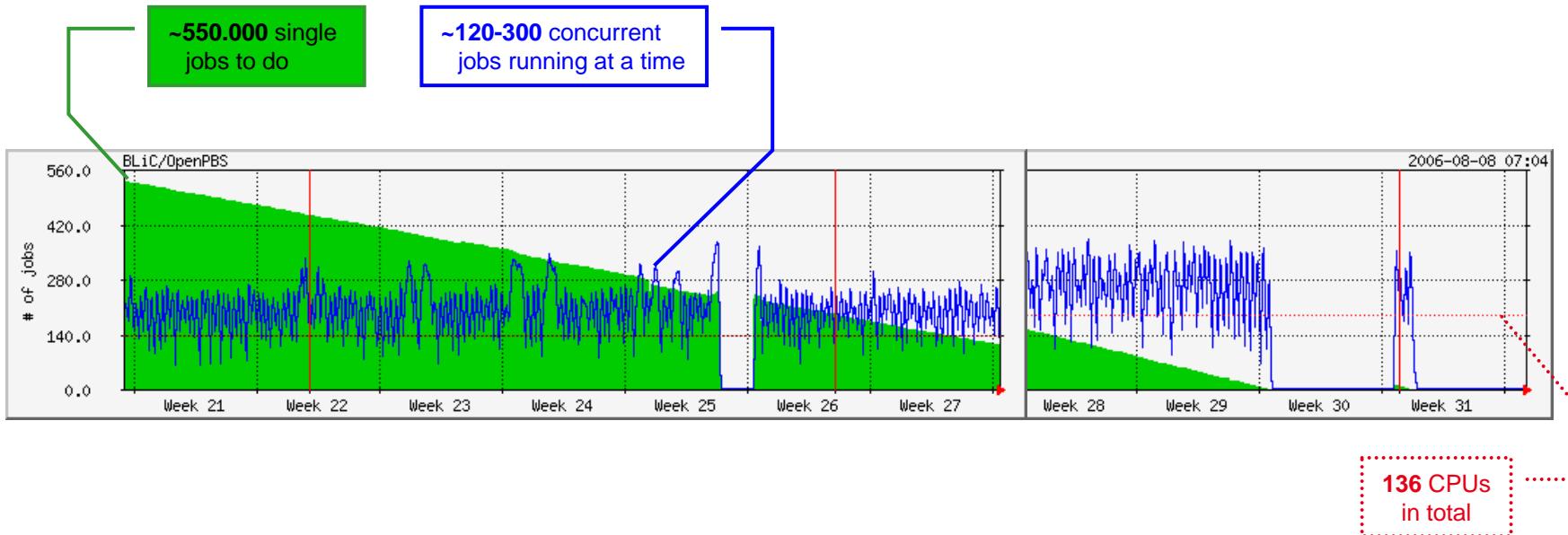


PADERBORN  
CENTER FOR  
PARALLEL  
COMPUTING

# Example re-annotation of GeneChip™ probes



Run times of several weeks for a single annotation job

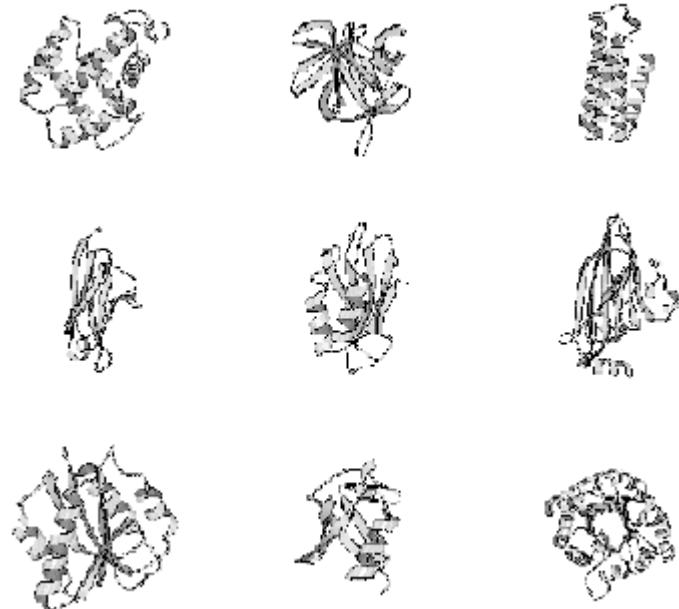
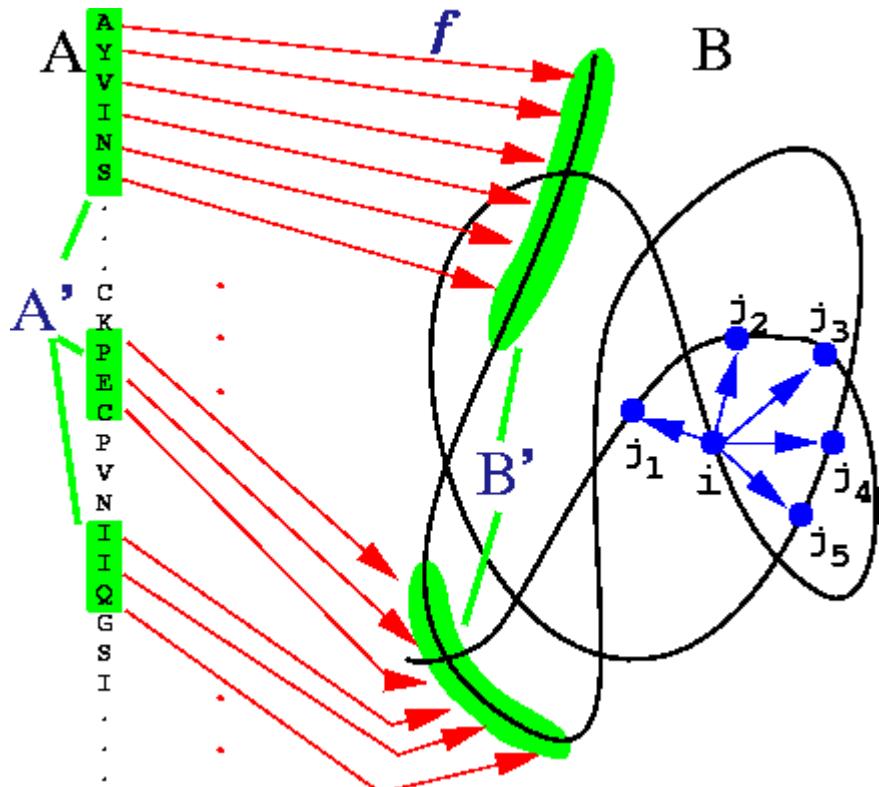


# Application „threading“



- A given target sequence is „threaded“ on all known protein folds, with gaps of any length at any position
- Typical run time: several days (evaluation 1-2 weeks)
- Software used: THREADER, 123D and other
- Issues: results often not conclusive
- Project impact: very low

# Fold prediction via 'threading'



A given sequence...

...is threaded in all positions...

...onto all known folds

# Application „*ab initio* prediction“



- A given target sequence is „folded“ into its likely 3D structure
- Typical run time: several hours
- Software used: DRAGON (Aszodi & Taylor)
- Issues: works only on small proteins
- Project impact: very low

# Application „docking“

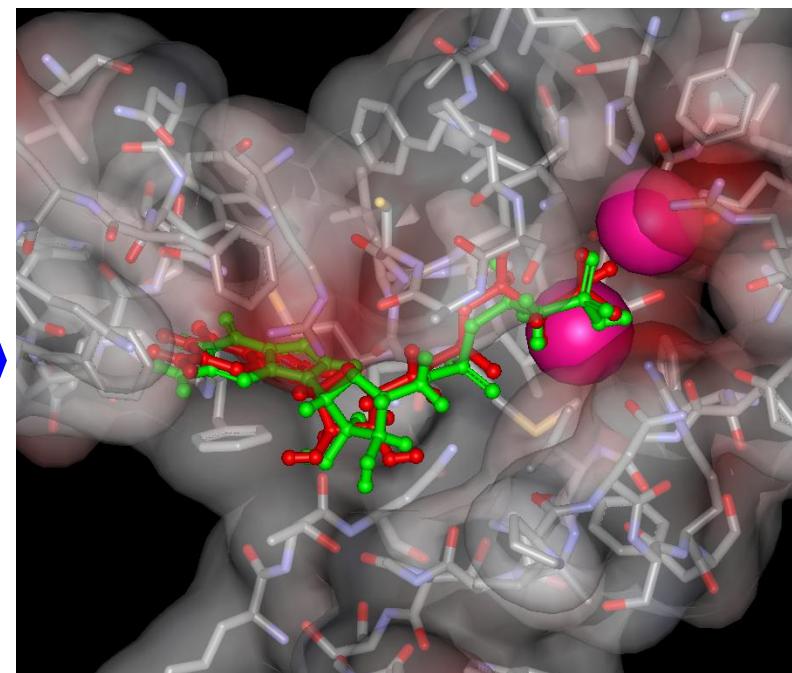
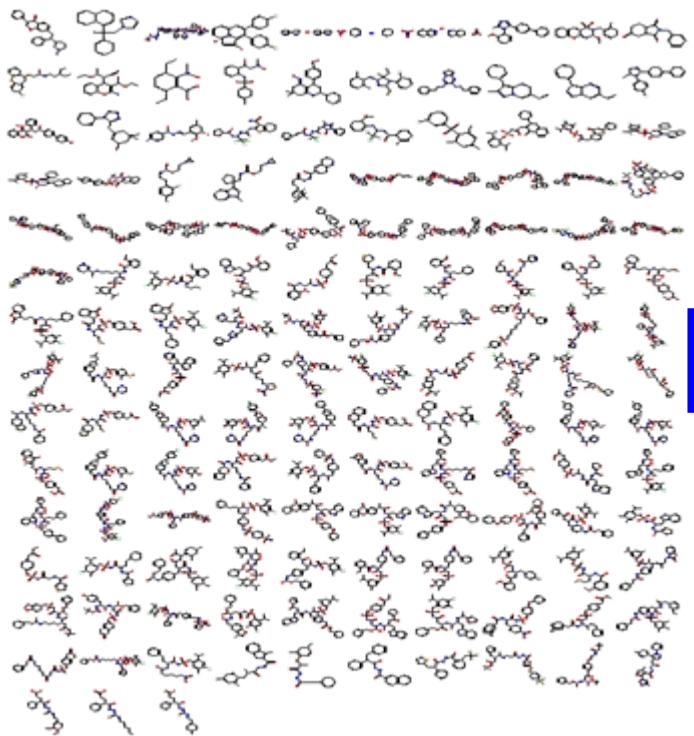


- Large numbers of chemical structures are docked into a predefined cavity of the protein target
- Typical run time: 1-2 days (evaluation 1-2 weeks)
- Software used: FLEXX, GOLD
- Issues: large numbers of files generated cause problems to file systems and their operation (e.g. listing, deletion of a few result sets takes several days)
- Project impact: very high (has regularly generated new guide structures for chemists)

# Virtual screening by ligand docking



## Find *in silico* suitable molecules for my target

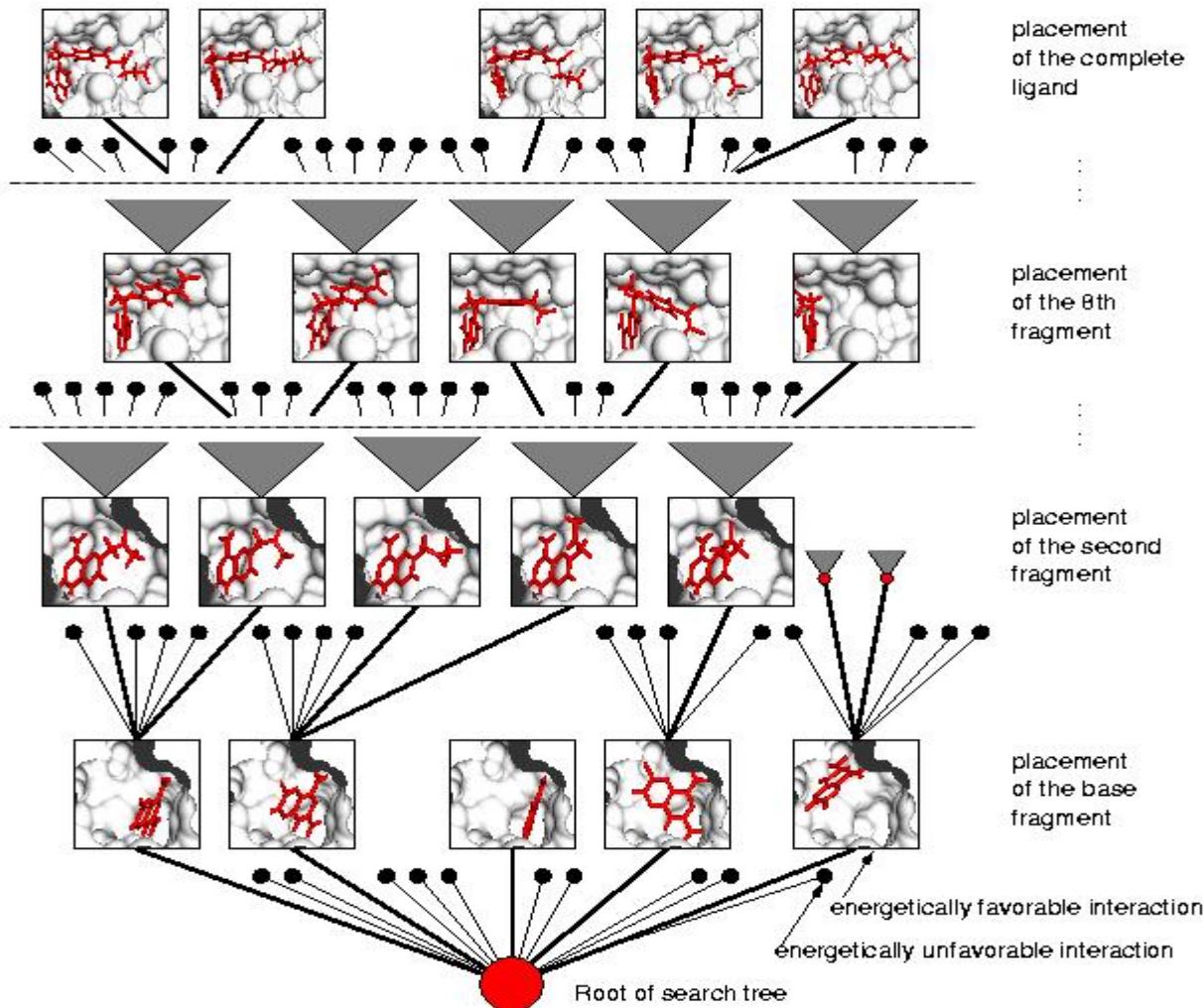


take large numbers of structures

calculate

find those that fit

# High speed-up by novel algorithm



BMBF Project

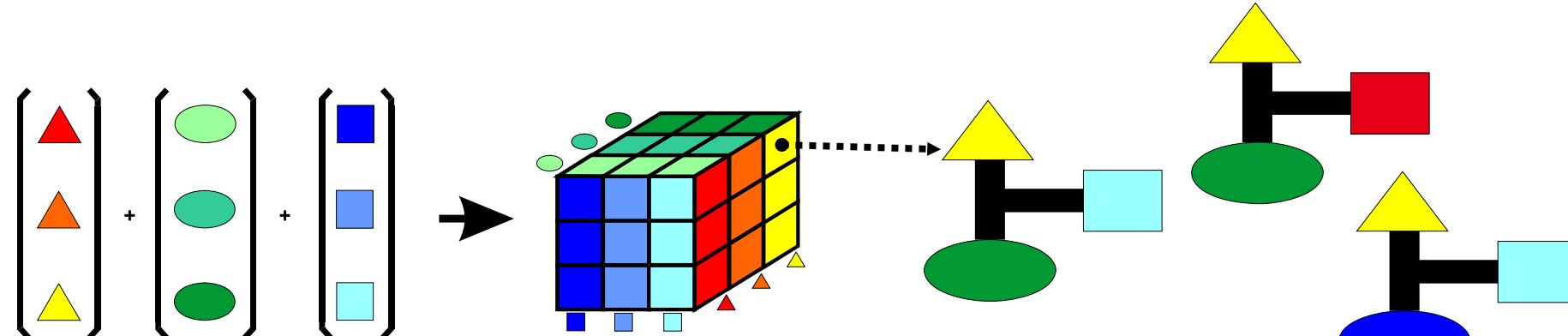
**Targid**



# Application „combinatorial chemistry“



- Possible combinatorial structures need to be generated & filtered
- Typical run time: days to weeks
- Software used: in-house
- Issues: full enumeration prohibitive
- Project impact: medium



# Managing the combinatorial explosion



VCL    **VP0020101**

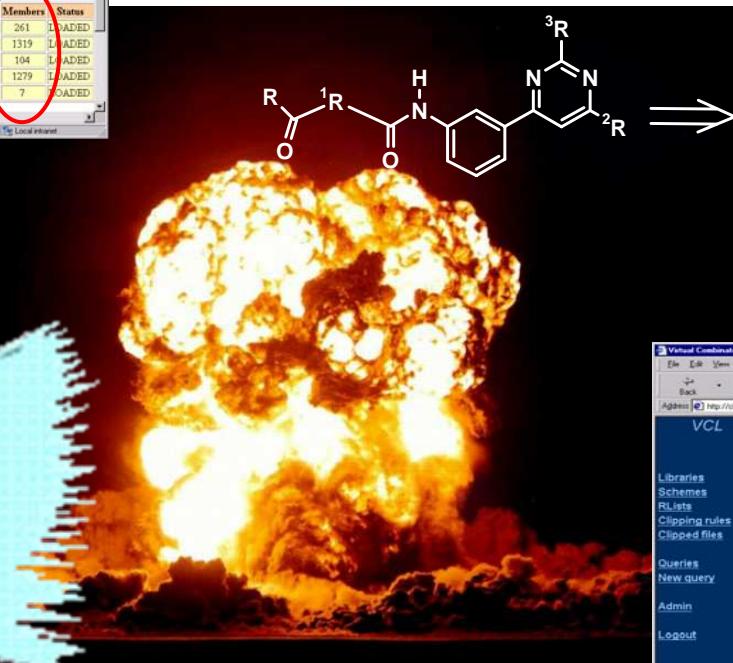
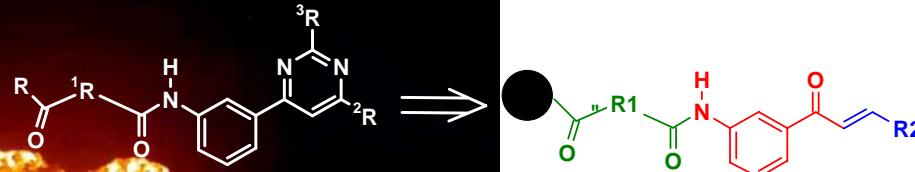
[Previous Next](#)

Libraries	Name	VP0020101
Schemes	Description	
RLists	Reaction scheme	<a href="#">VP0020101</a>
Clipping rules	Registered	22-APR-03
Clipped files	Updated	22-APR-03
Queries		
New query		
Admin		
Logout		

**Rgroup lists**

Position	Name	Members	Status
R1	Diacid (one clipped) / Acid - COOH removal (2nd)	261	LOADED
R2	Aldehyde / Aldehyde - CHO removal	2619	LOADED
R3	Amine / Amine - removal	104	LOADED
R4	Amine / Amine I - NH removal (skip amine II)	1279	LOADED
R5	Amino/Methyl/Eketone (COMe clipped) / Amine I - NH removal (2nd)	7	LOADED

One scaffold and 3000 reagents in 4 groups are enough to generate a library of **320'000'000'000** virtual compounds  
*In silico* screening would take **years** of time and a **petabyte** of space with conventional methods.



 Our Virtual Combinatorial Database retrieves all the hits in just a few seconds.



VCL Query structure

Libraries Schemes RLists Clipping rules Clipped files Queries New query Admin Logout

Mappings

Sub-library ID	Library name	Map type	R1	R2	R3	R4	R5	Total	Enumerate
20/65997	VP0020101	Span	Any	3	2	Any	Any	140205436	<a href="#">involve</a> <a href="#">cleanse</a> <a href="#">drained</a>
20/70007	VP0020102	Span	Any	3	2	Any	Any	47465460	<a href="#">involve</a> <a href="#">cleanse</a> <a href="#">drained</a>
30/701/1	VP0020201	Span	Any	3	2	Any	Any	7090776	<a href="#">involve</a> <a href="#">cleanse</a> <a href="#">drained</a>
30/701/2	VP0020202	Span	Any	3	2	Any	Any	24005520	<a href="#">involve</a> <a href="#">cleanse</a> <a href="#">drained</a>

Hits

Library ID	Library name	Total	Enumerate
702	VP0020102	47465460	<a href="#">standar</a> <a href="#">cleaned</a>
702	VP0020202	24005520	<a href="#">standar</a> <a href="#">cleaned</a>
659	VP0020101	14020538	<a href="#">standar</a> <a href="#">cleaned</a>
701	VP0020201	7090776	<a href="#">standar</a> <a href="#">cleaned</a>

# Application „druggability analysis“



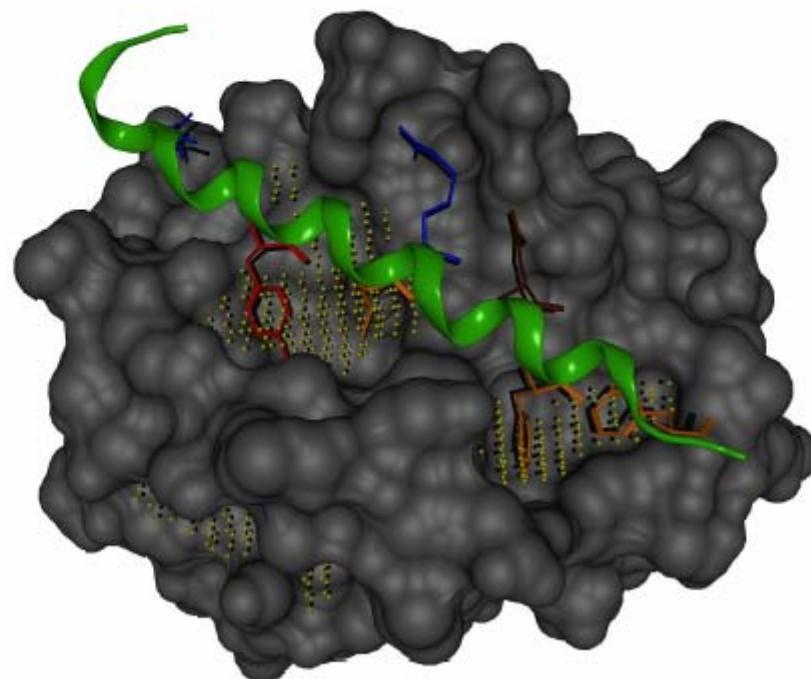
- Known protein structures are checked for suitable binding pockets
- Typical run time: days to weeks (followed by long evaluation time)
- Software used: in-house
- Issues: suitable visualization in order to speed-up human analysis
- Project impact: medium

# Application „druggability analysis“



Extracted from diploma thesis by Daniela Grimme

## Structural analysis



### Alanine-scanning mutational analysis:

$\Delta\Delta G$ (kcal /mol)
blue: 2.0 - 3.0
orange: >3.0 - 4.0
brown: > 4.0 - 5.0
red: > 5.0

### Identified Pocket Grid Points by the Pocket Analyser:

yellow dots

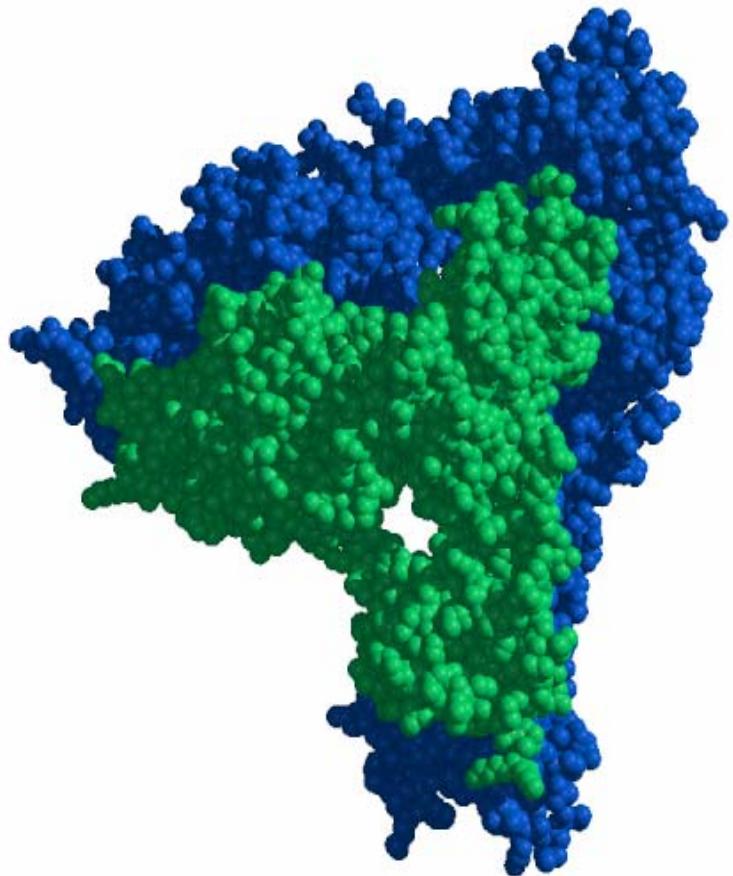
# Application „protein dynamics“



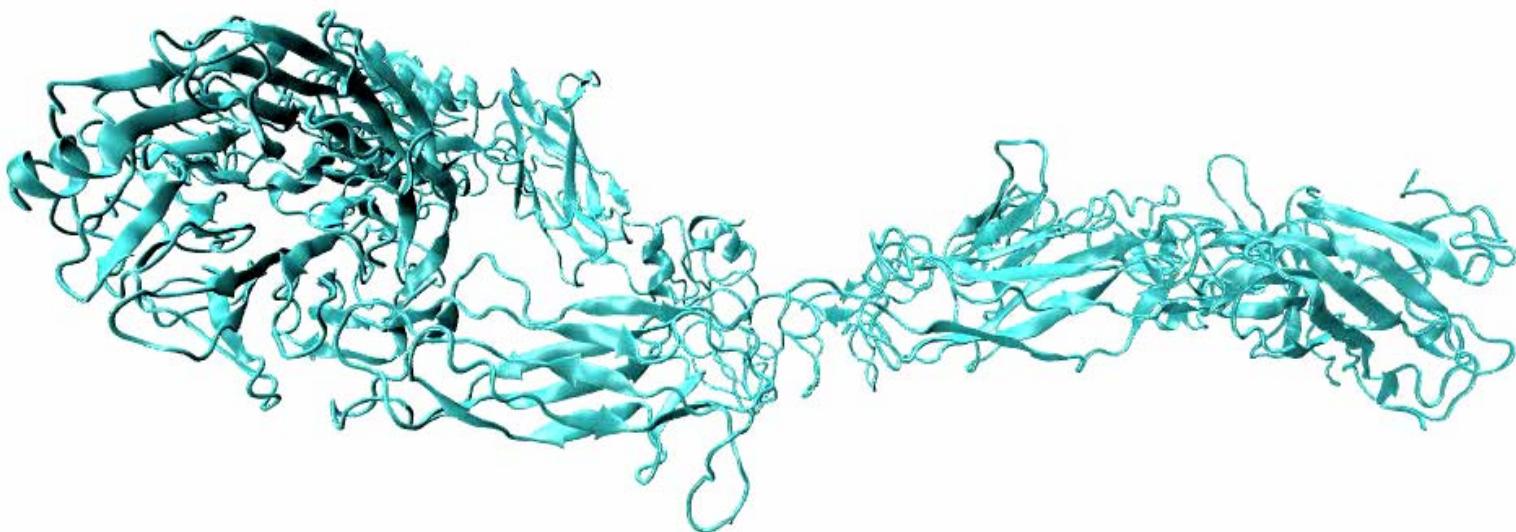
- Several applications, e.g. flexibility analysis of proteins (applied to kinases, integrins, antibodies...)
- Typical run time: days
- Software used: AMBER, NMSim/RCNMA, FIRST FRODA, YASARA, ...
- Issues: accuracy of parameterization; time scale (pico – nano seconds)
- Project impact: medium

# Structure of integrin avb3

Arnaout et al. Science 294 pp. 339 (2001)



# Simulation of flexibility in collaboration with Holger Gohlke



# Modelling of antibody flexibility



Simulation done with NMSim/RCNMA, Gohlke et al.  
July 1st, 2009 - Paris, France

# Application „association studies“



- genome-wide association studies: permutations ( $m$  markers processed  $n$  times,  $m \sim 1M$ ,  $n \sim 10000$ ) and genetic interactions ( $m^2/2$  tests)
- Typical run time:
  - Permutation-based FDR computation (10000 permutations) - about one week on 1 CPU
  - Interaction scan (not optimized yet), about 10000 markers - about 12 weeks on 1 CPU
- Software used: in-house
- Project impact: medium

# Future applications: Next Generation Sequencing



*Nature Biotechnology* 25, 149 (2007)  
Published online: 1 February 2007 | doi:10.1038/nbt0207-149

## Next-generation sequencing outpaces expectations

Catherine Shaffer<sup>1</sup>

1. Ann Arbor, Michigan

Growing demand in both the research and clinical markets is fueling the development – and funding – of more efficient genomic sequencing methods.

On January 8, Solexa, of Hayward, California, announced the completion of an early-access program evaluating its next-generation Genome Analysis system with customers and reiterated its intention to begin full commercial sales this quarter. Two months earlier, in anticipation of the entry of Solexa's technology and wanting a piece of the emerging market for whole-genome resequencing and analysis, San Diego, California-based microarray maker Illumina announced its intention to acquire the firm in a stock-for-stock transaction valued at around \$600 million (*Nat. Biotechnol.* 25, 10, 2007).



newscom

Next-generation sequencing is already several orders of magnitude more efficient than the Sanger capillary-array electrophoresis (CAE) machines that were the workhorse of the Human Genome Project.

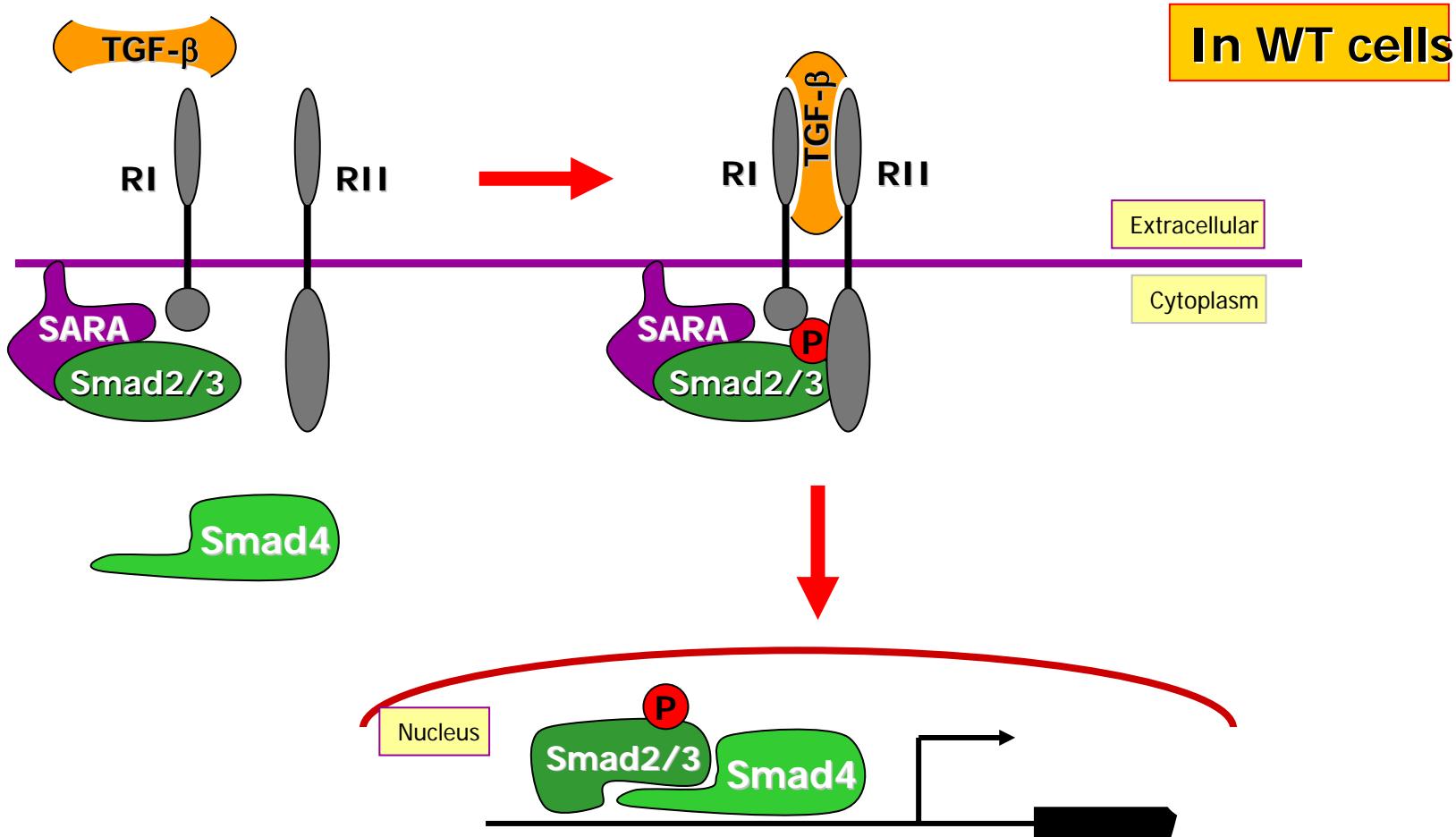
- “unclassical” HPC problem:  
~8 processor are enough, but disk speed would not be sufficient to store data as they are generated (there are solutions to this, however)
- Data volumes are too big for transfer to analysis computers (e.g. line speed between Sanger Centre and European Bioinformatics Institute [same campus, physical distance 20m] not sufficient for transfer); internet bandwidth far too small

# Future applications: Systems Biology



- Some trial applications, but limited acceptance in-house so far
- Simulation of individual pathways, cell populations etc. feasible
- Organ modeling (selected aspects only) becomes possible
- “Virtual human” still some distance away
- Issue: incomplete knowledge, lack of accurate rate constants, protein concentrations, lack of spatial resolution, lack of time resolution

# Example: VERY simplified TGF- $\beta$ pathway



# Current HPC infrastructure (DA only)



**Optimized compute server and cluster for analyzing large datasets**

64bit **IRIX** (UNIX of SGI)  
 • 32 CPUs (**MIPS/R16000**)  
 • 32 GByte Shared Memory

Origin 3400



For MEDIUM number of  
LARGE problems

64bit **Linux**  
 • 32 CPUs (INTEL Itanium)  
 • 256 GByte Shared Memory

Altix 3700



64bit **Linux** (Cluster)  
 • 94x 4 CPU-Cores (Xeon)  
 • 94x 8 GByte *distinct* Memory

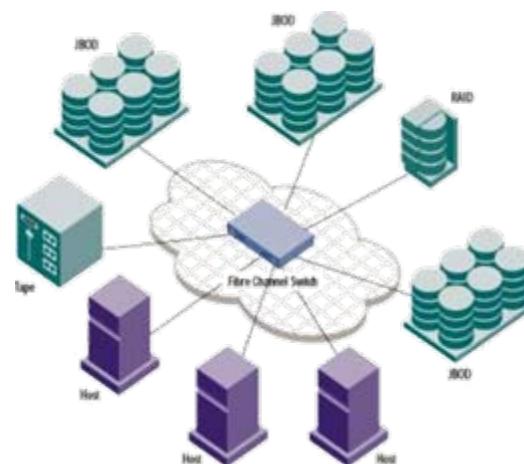
Linux-Cluster



For LARGE  
number of SMALL  
problems



**High-end graphics workstations with  
3D stereo support**



**7.5 TByte Shared Storage for biological and chemical databases and analysis results**

**IT infrastructure optimized for high performance and high throughput computing, using a large pool of sophisticated scientific software**

# Future challenges



- Compute power less an issue, but DATA deluge (e.g. personal genomes; quote from director of German Cancer Research Center: “In five years we will sequence all tumors of all our patients”
  - Storage
  - Bandwidth locally/Internet
- Power consumption may become limiting (1 entire nuclear power plant is needed just to serve German HPC centers)

# The end...

*...and finally we have calculated that our simulations have added 0.5 degrees to Global Warming...*



Thanks to

- Reinhard Schneider, Chris Sander, Alexander Reinefeld, Willie Taylor, Andras Aszodi, Holger Gohlke
- Jacques Barbanton, Thierry Convard
- Massimo de Francesco, Jerome Wojcik
- Christian Griebel, Anja von Heydebreck, Oliver Karch, Michael Krug, Mireille Krier, Daniela Grimme