

MODBASE, a database of annotated comparative protein structure models, and associated resources

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ABSTRACT

MODBASE (<http://salilab.org/modbase>) is a relational database of annotated comparative protein structure models for all available protein sequences matched to at least one known protein structure. The models are calculated by MODPIPE, an automated modeling pipeline that relies on the MODELLER package for fold assignment, sequence–structure alignment, model building and model assessment (<http://salilab.org/modeller>). MODBASE uses the MySQL relational database management system for flexible querying and CHIMERA for viewing the sequences and structures (<http://www.cgl.ucsf.edu/chimera/>). MODBASE is updated regularly to reflect the growth in protein sequence and structure databases, as well as improvements in the software for calculating the models. For ease of access, MODBASE is organized into different data sets. The largest data set contains 1 262 629 models for domains in 659 495 out of 1 182 126 unique protein sequences in the complete Swiss-Prot/TrEMBL database (August 25, 2003); only models based on alignments with significant similarity scores and models assessed to have the correct fold despite insignificant alignments are included. Another model data set supports target selection and structure-based annotation by the New York Structural Genomics Research Consortium; e.g. the 53 new structures produced by the consortium allowed us to characterize structurally 24 113 sequences. MODBASE also contains binding site predictions for small ligands and a set of predicted interactions between pairs of modeled sequences from the same genome. Our other resources associated with MODBASE include a

comprehensive database of multiple protein structure alignments (DBALI, <http://salilab.org/dbali>) as well as web servers for automated comparative modeling with MODPIPE (MODWEB, <http://salilab.org/modweb>), modeling of loops in protein structures (MODLOOP, <http://salilab.org/modloop>) and predicting functional consequences of single nucleotide polymorphisms (SNPWEB, <http://salilab.org/snpweb>).

INTRODUCTION

Genome sequencing efforts are providing us with complete genetic blueprints for hundreds of organisms, including humans. We are now faced with assigning, understanding and modifying the functions of proteins encoded by these genomes. This task is generally facilitated by protein 3D structures (1), which are best determined by experimental methods such as X-ray crystallography and NMR spectroscopy.

Over the past 2 years, the number of sequences in the comprehensive public sequence databases, such as Swiss-Prot/TrEMBL (2) and GenPept (3), have increased by a factor of 2.3 from 522 959 to 1 208 659 on August 15, 2003. In contrast, despite structural genomics, the number of experimentally determined structures deposited in the Protein Data Bank (PDB) increased by a factor of only 1.3 over the same period, from 17 443 to 23 096 (4). Thus, the gap between the numbers of known sequences and structures continues to grow.

Protein structure prediction methods are attempting to bridge this gap (5). The most accurate models are generally obtained by homology or comparative modeling (6). Comparative modeling is carried out in four sequential steps: finding known structures (templates) related to the sequence to be modeled (target), aligning the target sequence with the templates, building the model and assessing the model. Therefore, comparative modeling is only applicable when the target sequence is detectably related to a known

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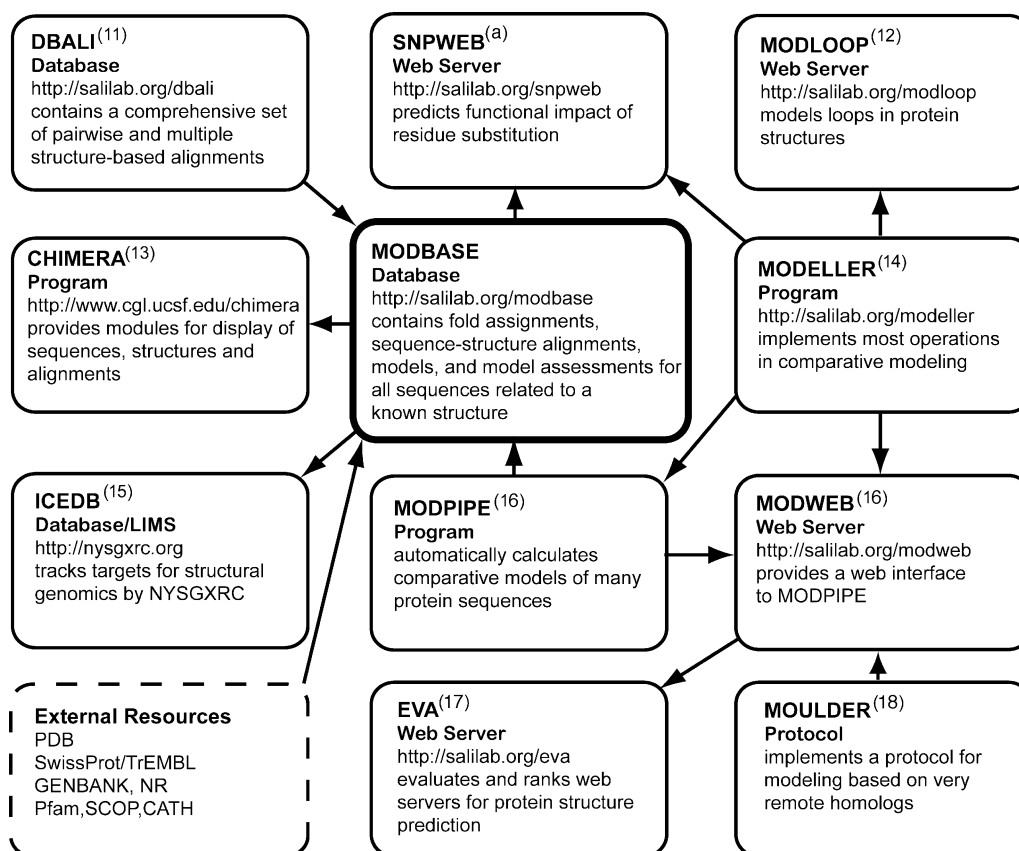


Figure 1. The relationships between MODBASE and associated resources. References are indicated by superscript numbers. ^aN. Mirkovic, M. A. Marti-Renom, A. Sali and A. N. A. Monteiro, submitted.

protein structure. Using automated comparative modeling, the fraction of sequences with comparative models for at least one domain has remained at ~57% over the past 2 years (7).

The utility of comparative protein structure models depends on their accuracy. The accuracy of comparative modeling is correlated with sequence identity between the template structure and the modeled sequence (5). Protein structure models with high accuracy can be obtained when template structures with >50% sequence identity to the modeled sequence are available. At this level of similarity, the errors usually include some incorrectly packed side chains, small shifts or distortions in the main chain and a few incorrectly modeled loops. Comparative models with medium accuracy are based on 30–50% sequence identity between the target and template sequences. Such models tend to have additional errors in some loop regions and occasional alignment errors. Below 30% sequence identity, alignment and fold assignment errors become the most significant sources of mistakes in comparative modeling. The accuracy of automated comparative protein structure modeling has been quantified by the CAFASP effort (8) as well as automated web servers EVA (9) and LIVEBENCH (10).

The process of comparative protein structure modeling usually requires the use of a number of programs to identify template structures, to generate sequence–structure alignments, to build the models and to evaluate them. In addition, various sequence and structure databases that are accessed by

these programs are needed. Once an initial model is calculated, it is generally refined and ultimately analyzed in the context of many other related proteins and their functional annotations. To facilitate these tasks for both expert and novice users, we have developed several programs, servers and databases (Fig. 1).

In this paper, we highlight the improvements of MODBASE that were implemented since the previous reports (7,19,20). These improvements include more sensitive and accurate software for calculating comparative models, an updated interface that relies on the CHIMERA package for viewing alignments and structures, integration of information about small ligand binding sites and protein–protein interactions with the model data sets, measurement of the contributions of structural genomics to the coverage of the sequence–structure space, and closer integration with a variety of other resources for deriving and using comparative models.

CONTENTS

MODBASE core

Models in MODBASE are calculated using MODPIPE, our entirely automated software pipeline for comparative modeling (16). MODPIPE can calculate comparative models for a large number of protein sequences, using many different template structures and sequence–structure alignments.

Table 1. Summary of the automated modeling by MODPIPE for seven of the 53 structures determined by NYSGXRC

NYSGXRC X-ray structure PDB code	Database accession number	Annotation	MODBASE models			
			Total sequences	Fold and model	Fold	Model
1b54	P38197	Hypothetical UPF0001 protein YBL036C	151	132	2	17
1f89	P49954	Hypothetical 32.5 kDa protein YLR351C	553	488	55	10
1njr	Q04299	Hypothetical 32.1 kDa protein in ADH3-RCA1 intergenic region	4	1	0	3
1nkq	P53889	Hypothetical 28.8 kDa protein in PSD1-SKO1 intergenic region	379	207	172	0
1jzt	P40165	Hypothetical 27.5 kDa protein in SPX19-GCR2 intergenic region	1058	39	1006	13
1jr7	P76621	Hypothetical protein ygaT	11	10	0	1
1ku9	3025177	YF63_METJA hypothetical protein MJ1563	598	131	214	253

The complete table is accessible at http://salilab.org/modbase/models_nysgxrc.html. The 'PDB code', 'Database accession number' and 'Annotation' columns define the template structure. 'Total sequences' is the number of sequences in SwissProt/TrEMBL could be modeled reliably using the NYSGXRC structure as a template. A sequence is modeled reliably if it has a reliable PSI-BLAST E-value of $\leq 10^{-4}$ ('Fold'), a reliable model with model score ≥ 0.7 ('Model') or both ('Fold and model').

MODPIPE relies on the various modules of MODELLER for its functionality and is streamlined for large-scale operation on a cluster of PCs using scripts written in PERL.

The templates used for model building consist of representative multiple structure alignments extracted from DBALI (11). These alignments were prepared by the SALIGN module of MODELLER (M. S. Madhusudan, M. A. Marti-Renom, A. Sali, in preparation), which implements a multiple structure alignment method similar to that in the program COMPARER (21). Sequence profiles are constructed for both the target sequences and the templates by scanning against the Swiss-Prot/TrEMBL database of sequences, relying on the BUILD_PROFILE module of MODELLER (N. Eswar, M. S. Madhusudan and A. Sali, in preparation). BUILD_PROFILE is similar to PSI-BLAST (22), except that local dynamic programming is used instead of the BLAST heuristics. Sequence-structure matches are established by aligning the target sequence profile against the template profiles, using local dynamic programming in the SALIGN module and an assessment of statistical significance similar to that of PSI-BLAST (22) and COMPASS (23). Significant alignments covering distinct regions of the target sequence are chosen for modeling. Models are calculated for each of the sequence-structure matches using MODELLER (24). The resulting models are then evaluated by a composite model quality criterion that depends on the compactness of a model, the sequence identity of the sequence-structure match and statistical energy Z-scores (25).

The thoroughness of a search for the best model is modulated by a number of user parameters, including E-value thresholds for identifying useful sequence-structure relationships and the degree of conformational sampling given a sequence-structure alignment. The validity of sequence-structure relationships is not pre-judged at the fold detection stage, but is assessed after the construction of the model and its evaluation. This approach enables a thorough exploration of fold assignments, sequence-structure alignments and conformations, with the aim of finding the model with the best evaluation score.

The models in the version of MODBASE available until the end of 2003, however, were calculated using an earlier version of MODPIPE. These models were based on single template structures and built using sequence-structure matches generated by PSI-BLAST (22) and IMPALA (26).

Models in MODBASE are organized into data sets. The largest data set contains models of all sequences in the Swiss-Prot/TrEMBL database that are detectably related to at least one known structure in the PDB. Currently, there are 1 262 629 models for domains in 659 495 of the 1 182 126 sequences in the Swiss-Prot/TrEMBL database, with an average length of 235 residues per model. For example, there are models for 32 985 human sequences, 22 880 sequences from *Arabidopsis thaliana*, 15 195 sequences from *Drosophila melanogaster* and 9691 sequences from *Escherichia coli*. Because the sequence databases contain sequence information of different strains and mutations, the number of unique sequences for a given organism exceeds the number of genes in the genome. For example, there are about 16 700 unique *E.coli* sequences in Swiss-Prot/TrEMBL, compared with ~4400 predicted genes in the *E.coli* genome.

Predicted interacting proteins

MODBASE links pairs of modeled sequences from the same organism that are predicted to interact with each other (H. Braberg, F. Davis, J. Espadaler, B. Oliva, A. Sali, M. S. Madhusudan, in preparation). First, residue contacts between the two models are predicted based on a match of both modeled sequences to different parts of a single PDB file. Next, the residue contacts in a hypothetical interface are scored by their propensities to span an interface. These propensities were extracted from ~8000 representative pairs of interacting domains. If the total score is sufficiently large, the two modeled sequences are predicted to interact with each other. The method is an extension of the Rosetta Stone approach, which was first applied to sequences (27) and is similar to several studies applied to structures (28,29). ~10 000 modeled sequences in MODBASE are linked via ~30 000 predicted pairwise interactions, with an estimated false positive ratio of 25%.

Predicted ligand binding sites

MODBASE contains a list of the binding sites of known structure for ~50 000 ligands found in the PDB (30). The ligands include small molecules, such as metal ions, nucleotides and saccharides, but exclude water molecules, peptides and nucleic acids. Binding sites in the template structures are defined by residues with atoms within 5 Å of any ligand atom. In addition to the actual binding sites in the known structures,



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File Structure Tools Preferences

	81	91	101	111
Consensus	a a v r t i r e a f	g d d a a f g v D i	n q a	
Conservation				
mr	AVVRSIRQAV	GDDFGIMVY	NQS	
gald	NTVAQIREAF	GNQIEFGLDF	HGR	
mleipp	KHVVTIKREL	GDSASVRVDV	NQY	
mleipp	RHIEKIIERV	GDRAAVRVDI	NQA	
naaar	EPVRAVRERF	GDDVLLQVDA	NTA	
maalct	APIFHIDVYG	TIGAAFDVDI	KAM	
enolyeast	DAIK . . AAGH	DGKVKIGLDC	ASSEFFKDGK	YDLDFKNPNS
enolhal	EAVETVADDF	GFAISFGLDV	ARAELYDDEA	DGVVYDDGVK
Consensus	 w d e p	q a i v l a q a l e	p y g l v l i E q P	v a e e d a
Conservation				
mr	 LDVP	AAIKRSQALQ	QEGVTWIEEP	TLQHD Y
gald	 VSAP	MAKVLIKELE	PYRPLFIEEP	VLAEQ A
mleipp	 WDES	QAIRACQVLG	DNGIDLIEQP	ISRIN R
mleipp	 WDEN	TASVWIPRLE	AAGVELVEQP	VARSN F
naaar	 YTLG	DAPO . LARLD	PFGLLLIEQP	LEED V
maalct	 AD	YIQTLAEEAK	PFHLR . IE GP	MDVEDRQKQM
enolyeast	DKSKWLTGPQ	LADLYHSLMK	RYPIVSIEEDP	FAEDDWEAWS
enolhal	 STEE	QIEYIAGKVE	EYDLVYVEEDP	LDENDYEAF
Consensus	e g h r r l a a q t	. v p i . a	. d e . l f s t n d	a f d a a a i . . .
Conservation				
mr	EGHQRIQSKL	NVP VQM	GEN . WLGPEE	MFKALSI . . .
gald	EYYPKLAAQT	HIP LAA	GER . MFSRFD	FKRVLEA . . .
mleipp	GGQVRLNQRS	PAP IMA	. DESIESVED	AFSLAAD . . .
mleipp	DALRRLSADN	GVA ILA	. DESLSSLAS	AFELARH . . .
naaar	LGHAEALARRI	QTP ICL	. DESIVSARA	AADAIKL . . .
maalct	EAMRDLRAEL	DGRGVDAELV	ADE . . . WCNT	VEDVKFFTDN
enolyeast	HFFKTAGIQ .	. IVA	. D . LTVTNP	KRIATAIEKK

Out Help

Figure 2. CHIMERA and the MultAlign Viewer extension. The barrel domains of selected enolase superfamily members are shown, with sidechains displayed for active site metal-binding residues. The multiple sequence alignment contains the corresponding sequences with the metal-binding residues colored in the same way. The CHIMERA interface allows user selections within the sequences, to highlight the corresponding regions of the structures and vice versa.

MODBASE also contains predicted binding sites on the template structures and models. The predicted binding sites on the template structures are inherited from any related known structure if at least 75% of the binding site residues are within 4 Å of the template residues in a global superposition of the

two structures and if at least 75% of the binding site residue types are invariant. The structure superpositions are obtained from our comprehensive database of all pairwise structure superpositions, DBALI (11). The predicted binding sites on the model are defined by all the model residues that are aligned

with either the actual or predicted binding site residues on the template. Forty-four percent of the models in MODBASE have at least one predicted binding site for a small ligand.

Application of MODBASE to structural genomics

MODBASE provides the basis for target selection and structure-based annotation by the New York Structural Genomics Research Consortium (NYSGXRC) (15), one of the nine pilot centers in the Protein Structure Initiative supported by the NIH (<http://www.nigms.nih.gov/psi/>). We highlight here the increased coverage of the sequence–structure space (31) by the NYSGXRC structures.

Relying on the 53 NYSGXRC structures, MODPIPE produced models for domains in 24 113 sequences in Swiss-Prot/TrEMBL (Table 1); the average target–template sequence identity was 18.9%. Only 10% of the sequences are modeled based on >30% sequence identity over more than 75 residues; 81% of the sequences have models that are predicted to have the correct fold based on the model score or the PSI-BLAST E-value (Table 1). The modeled sequences come from 1729 different organisms. Because the structures determined by NYSGXRC were selected by avoiding more than 30% sequence identity to any of the previously determined structures, most of the modeled sequences have been characterized structurally for the first time. The large number of models calculated based on the newly determined structures illustrates and justifies the premise of structural genomics.

ACCESS AND INTERFACE

MODBASE is queryable through the web at <http://salilab.org/modbase> by PDB codes, Swiss-Prot/TrEMBL and GenPept accession numbers, annotation keywords, model reliability, model size, target–template sequence identity, alignment significance, and sequence similarity to the modeled sequences as detected by BLAST.

Models in MODBASE are organized into a number of data sets whose access by different users is regulated using a cookie mechanism (<http://www.acm.org/crossroads/xrds7-1/cookies>). The largest data set includes all modeled sequences from the Swiss-Prot/TrEMBL database and is freely accessible to all academic scientists. Other data sets include models calculated for NYSGXRC, MODWEB data sets from anonymous users and data sets associated with our other modeling projects.

The output of a search is displayed on pages with varying amounts of information about the modeled sequences, template structures, alignments and functional annotations. These tables also contain links to other sequence, structure and function annotation databases, such as PDB (4), GenBank (3), Swiss-Prot/TrEMBL (2), CATH (32), Pfam (33), ProDom (34), and UCSC Genome Browser (35). In addition, MODBASE models are directly accessible from the Swiss-Prot/TrEMBL sequence pages at <http://www.expasy.org> and UCSC Genome Browser at <http://genome.ucsc.edu>.

Visualization of sequences, structures and alignments with CHIMERA

To simplify the process of visualizing the models contained in MODBASE, we created an extension to the CHIMERA Molecular Modeling System, which was developed by the

researchers in the Resource for Biocomputing, Visualization, and Informatics at UCSF (Fig. 2) (<http://www.cgl.ucsf.edu/chimera>) (30). The data contained in a MODBASE entry are divided among three different files: a template file, a model file and an alignment file. Manually downloading and opening these files with visualization tools can be a cumbersome process. The new CHIMERA extension enables a web browser to communicate directly with CHIMERA. By clicking on a single link associated with each MODBASE model, information related to the model is transmitted to CHIMERA, which then displays the structures of the template and the model; their alignment is also displayed using CHIMERA's multiple sequence alignment viewer, MultAlign Viewer. The user can then apply CHIMERA's rich set of visualization and analysis tools to further study the model. CHIMERA runs on a local computer and is available for Linux, Windows, Mac OS 10.2, IRIX and COMPAQ Tru64 UNIX operating systems.

FUTURE DIRECTIONS

MODBASE will be updated at least monthly to reflect the growth of the sequence and structure databases, as well as improvements in the methods and software used for calculating the models. We also plan to integrate access to the sequence profiles in the web-based interface and to include tools for target selection for structural genomics. Furthermore, we plan to improve the flexibility of searching for ligand binding sites. And finally, we will include additional search options to support associating structure and function.

CITATION

Users of MODBASE are requested to cite this article in their publications.

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