# Target selection and annotation for the structural genomics of the amidohydrolase and enolase superfamilies

Ursula Pieper · Ranyee Chiang · Jennifer J. Seffernick · Shoshana D. Brown · Margaret E. Glasner · Libusha Kelly · Narayanan Eswar · J. Michael Sauder · Jeffrey B. Bonanno · Subramanyam Swaminathan · Stephen K. Burley · Xiaojing Zheng · Mark R. Chance · Steven C. Almo · John A. Gerlt · Frank M. Raushel · Matthew P. Jacobson · Patricia C. Babbitt · Andrej Sali

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**Abstract** To study the substrate specificity of enzymes, we use the amidohydrolase and enolase superfamilies as model systems; members of these superfamilies share a common TIM barrel fold and catalyze a wide range of chemical reactions. Here, we describe a collaboration between the Enzyme Specificity Consortium (ENSPEC) and the New York SGX Research Center for Structural Genomics (NYSGXRC) that aims to maximize the structural coverage of the amidohydrolase and enolase superfamilies. Using sequence- and structure-based protein comparisons, we first selected 535 target proteins from a variety of genomes for high-throughput

Current affiliation of SGX Pharmaceuticals is Eli Lilly and Company, 10505 Roselle Street, San Diego, CA 92121, USA.

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#### U. Pieper (🖂)

Departments of Biopharmaceutical Sciences and Pharmaceutical Chemistry, California Institute for Quantitative Biosciences, University of California at San Francisco, Byers Hall at Mission Bay, Office 501-32, 1700 4th Street, San Francisco, CA 94158, USA e-mail: ursula@salilab.org URL: http://calilab.org

URL: http://salilab.org

R. Chiang  $\cdot$  J. J. Seffernick  $\cdot$  M. E. Glasner  $\cdot$  L. Kelly  $\cdot$  N. Eswar

Departments of Biopharmaceutical Sciences and Pharmaceutical Chemistry, California Institute for Quantitative Biosciences, University of California at San Francisco, Byers Hall at Mission Bay, Office 501, 1700 4th Street, San Francisco, CA 94158, USA

### S. D. Brown

Department of Biopharmaceutical Sciences, California Institute for Quantitative Biosciences, University of California at San Francisco, Byers Hall at Mission Bay, Office 501C, 1700 4th Street, San Francisco, CA 94158, USA structure determination by X-ray crystallography; 63 of these targets were not previously annotated as superfamily members. To date, 20 unique amidohydrolase and 41 unique enolase structures have been determined, increasing the fraction of sequences in the two superfamilies that can be modeled based on at least 30% sequence identity from 45% to 73%. We present case studies of proteins related to uronate isomerase (an amidohydrolase superfamily member) and mandelate racemase (an enolase superfamily member), to illustrate how this structure-focused approach can be used to generate hypotheses about sequence–structure–function relationships.

**Keywords** Amidohydrolase and enolase superfamilies · Structural genomics · Structure annotation · Target selection

J. M. Sauder · S. K. Burley SGX Pharmaceuticals Inc, 10505 Roselle Street, San Diego, CA 92121, USA

J. B. Bonanno · S. C. Almo Departments of Biochemistry and Physiology and Biophysics, Albert Einstein College of Medicine, Bronx, NY 10461, USA

S. Swaminathan Biology Department, Brookhaven National Laboratory, Upton, NY 11973, USA

X. Zheng · M. R. Chance Case Center for Proteomics & Bioinformatics, Case Western Reserve University, Cleveland, OH 44106, USA

J. A. Gerlt Departments of Biochemistry and Chemistry, University of Illinois, Urbana, IL 61801, USA

# Abbreviations

PDB	Protein Data Bank
NYSGXRC	New York SGX Research Center for
	Structural Genomics
ENSPEC	Enzyme specificity consortium
SFLD	Structure function linkage database
PSI	Protein structure initiative
NR	Non-redundant database of protein
	sequences
ESI	Electrospray ionization
HMM	Hidden Markov Model

### Introduction

A long-standing challenge in biology is to predict the molecular function of proteins from their sequences and/or structures. This task is facilitated by a limited number of domain folds [1], restricting the set of structural types that must be studied in deducing a much larger set of functions. Special challenges, however, exist for functional prediction in different classes of proteins. For example, the function of an enzyme often cannot be correctly predicted because there are no clear links from the domain fold to the catalytic function and substrate specificity. Off-setting these problems, studies of genomes and sets of homologous proteins demonstrate that some aspects of catalysis are often conserved between evolutionarily-related proteins, even when these proteins catalyze different overall reactions [2-4]. This empirical observation restricts the functional space that must be considered, further

Department of Chemistry, Texas A&M University, P.O. Box 30012, College Station, TX 77842-3012, USA

Departments of Biopharmaceutical Sciences and Pharmaceutical Chemistry, California Institute for Quantitative Biosciences, University of California at San Francisco, 600 16th St., Box 2240, Genentech Hall at Mission Bay, Room N472C, San Francisco, CA 94158-2517, USA

#### P. C. Babbitt

Departments of Biopharmaceutical Sciences and Pharmaceutical Chemistry, California Institute for Quantitative Biosciences, University of California at San Francisco, Byers Hall at Mission Bay, Office 508E, 1700 4th Street, San Francisco, CA 94158, USA

#### A. Sali (🖂)

Departments of Biopharmaceutical Sciences and Pharmaceutical Chemistry, California Institute for Quantitative Biosciences, University of California at San Francisco, Byers Hall at Mission Bay, Office 503B, 1700 4th Street, San Francisco, CA 94158, USA e-mail: sali@salilab.org URL: http://salilab.org facilitating prediction and leading to definitions of homologous sets of enzymes in terms of protein superfamilies and families based not only on structural conservation, but also on functional conservation [5]: Superfamily members share a common ancestor and potentially some aspects of function, while members of the same family are isofunctional, catalyzing the same overall reaction(s).

The large and diverse amidohydrolase and enolase superfamilies provide a particularly attractive opportunity to study the problem of predicting substrate specificity and enzymatic mechanisms from evolutionary and physical perspectives. These superfamilies are attractive targets because significant knowledge about the specificity of many of their members already exists, while there are still large areas of their sequence space where we do not have any structural or functional information.

Members of the amidohydrolase superfamily catalyze the hydrolysis of a wide range of substrates bearing amide or ester functional groups at carbon and phosphorus centers [6, 7]. A common feature for this superfamily is a mononuclear or binuclear metal center coordinated in a  $(\beta/\alpha)_8$ -barrel (TIM barrel) polypeptide chain fold. The active site is formed by loops at the C-terminal ends of the  $\beta$ -strands. Currently, 36 named families have been identified based on the experimentally verified catalytic reactions. The set of superfamily sequences has been clustered into 90 subgroups based on sequence and in some cases active site similarities (the Structure-Function Linkage Database [8]: http://sfld.rbvi.ucsf.edu). In some subgroups, additional information about chemical reactions catalyzed by subgroup members is available; for many of the subgroups, however, no information about functional specificity is available.

Enolase superfamily members catalyze the abstraction of a proton  $\alpha$  to a carboxylic acid to form an enolate anion intermediate [9, 10]. Members of this superfamily share an N-terminal  $\alpha + \beta$  capping domain, as well as a C-terminal  $(\beta/\alpha)_7\beta$ -barrel domain (modified TIM barrel). The active site is formed by loops at the C-terminal ends of the TIM barrel  $\beta$ -strands and two flexible loops from the capping domain; the active site also includes a Mg<sup>2+</sup> ion [11]. Reactions catalyzed by enolases are less diverse than those of the amidohydrolases. The enolases are currently organized into 16 named families and 6 subgroups [8]. Approximately 50% of the sequences in the superfamily are of unknown function.

The amidohydrolase and enolase superfamilies are the focus of our Enzyme Specificity Consortium (ENSPEC), members of which include protein crystallographers, enzymologists, and computational biologists. We aim to predict the substrate specificity of an enzyme based on its experimentally determined and/or modeled structure

F. M. Raushel

M. P. Jacobson

[2–4, 7, 10–42]. This goal has been enabled by determination of crystallographic structures representing many of the amidohydrolase and enolase families.

To maximize the number of experimentally determined structures, ENSPEC has collaborated with the New York SGX Research Center for Structural Genomics (NYSGXRC), which is one of the four large-scale production centers of the Protein Structure Initiative (PSI) (http://www.nigms.nih.gov/ Initiatives/PSI; [43]). NIH guidelines mandate that 70% of the PSI targets come from diverse protein families selected by and shared among the four production centers [43]. About 15% of the targets are reserved for proteins of biomedical relevance defined by each center, and the remaining 15% are "community-nominated" targets. Several hundred of the NYSGXRC community targets are amidohydrolases and enolases nominated by ENSPEC. To date, the collaboration has determined 25 amidohydrolase and 50 enolase structures, contributing substantially to the total of 154 amidohydrolase and 89 enolase structures in the Protein Data Bank (PDB; 6/16/08) [44].

We begin by outlining the data sources and methods used for target selection and structure-based functional annotation (Materials and Methods). Second, we present the results of the target selection process, the status of the selected targets in the structural genomics pipeline, and the improvement in the modeling of the amidohydrolase and enolase superfamilies made possible by the new crystallographic structures (Results and Discussion). We conclude by discussing the biological impact of two sample target structures.

### Materials and methods

# Target selection

Target selection begins by identifying sequences of known members of the superfamilies (seed sequences), followed by filtering to obtain an initial target list. To identify additional members, we applied sequence- and structurebased expansion methods, followed by filtering for source organisms preferred by NYSGXRC. Superfamily membership for the additional targets was verified by expert curators by inspecting their sequences for probable catalytic residues. A web-based target selection tool was also constructed for further manual filtering to obtain the final target list.

#### Seed sequence sources

Verified amidohydrolase and enolase superfamily sequences (i.e., seed sequences) were obtained from the Structure Function Linkage Database (SFLD; http://sfld.rbvi.ucsf.edu/) [8].

The SFLD database is a manually constructed database that classifies enzymes hierarchically, based on specific sequence, structure, and functional criteria. The database is updated by a semi-automated method that detects new superfamily members by matching their sequences to Hidden Markov Models trained using the sequences of verified superfamily members, with subsequent manual inspection to verify the presence of catalytic residues. In June 2005, when our target list was constructed, the SFLD contained 3,701 amidohydrolases and 1,795 enolases.<sup>1</sup>

### Filtering of seed sequences

PSI guidelines require that structural genomics targets share  $\sim 30\%$  or less amino acid sequence identity to a known theedimensional structure. To satisfy this condition, the seed amidohydrolase and enolase sequences were processed using the automated comparative modeling server MODWEB (http://salilab.org/modweb) [45]. Sequences with more than 30% sequence identity to any structure in the PDB over at least 70% of their length were identified and excluded from further consideration.

# Sequence-based expansion of amidohydrolase and enolase superfamily members

For each seed amidohydrolase and enolase, homologous sequences in the UNIPROT database [46] were identified by the BUILD\_PROFILE routine of MODELLER-9 [45]. BUILD\_PROFILE is an iterative database-searching tool that relies on local dynamic programming to generate alignments and a robust estimate of their statistical significance. This method identified additional potential amidohydrolase and enolase sequences that were not present in the seed sequence pools.

# Structure-based expansion of amidohydrolase superfamily members

In addition to the SFLD entries, we also used the known amidohydrolase superfamily structures to find additional potential amidohydrolase superfamily members (this expansion was not performed for the enolase superfamily). We began by splitting 100 PDB files containing known amidohydrolase structures (June 2005) into separate monomeric structures and clustering them at 80% sequence identity. The resulting 45 non-redundant structures were

<sup>&</sup>lt;sup>1</sup> The numbers of sequences in the publicly accessible version of the SFLD differ from those cited here because large numbers of sequences are undergoing curation at any given time and are therefore not yet listed on the public site.

used for comparative modeling using the automated modeling server MODWEB [45].

First, each structure sequence was used as a query to find its homologs in UNIPROT using PSIBLAST [47]. Second, these homologs were modeled using the corresponding structure as a template. All models were deposited in our comprehensive MODBASE database of comparative protein structure models (http://salilab.org/modbase/; direct links to the datasets can be found in the supplemental materials) [48]. In addition, the amidohydrolase homologs found in UNIPROT were filtered by removing known amidohydrolase superfamily members, and then subjected to standard comparative modeling with MODWEB using all non-redundant chains in the PDB as potential templates. This step allowed us to eliminate sequences that are likely members of other superfamilies, judged by sequence identity and coverage.

### Filtering by organism

While seed sequences could come from any genome, the additional amidohydrolase sequences identified by sequence- and structure-based expansions were filtered for ease of cloning to include only 79 organisms with genomic DNA available to NYSGXRC in 2005 and the marine metagenome from the Sargasso Sea sequencing project (formerly called environmental sequences) [49]. For simplicity, we call the 79 genomes plus the marine metagenome the "NYSGXRC genomes" (Table 1). The NYSGXRC reagent genomes have since been expanded to include over 115 organisms.

### Verification of catalytic residues

The putative amidohydrolase sequences resulting from the sequence- and structure-based expansions were aligned to existing amidohydrolase Hidden Markov Models (HMMs) in the SFLD and manually inspected for probable catalytic residues. The final target list only includes sequences with at least 70% of the catalytic residues present.

### Target selection tool

For final manual filtering of the target list, we constructed a web-based target selection tool. The tool comprises a combination of MySQL database tables with an interactive web-interface using LAMP [50]. It contains information about the sequences, including UNIPROT annotation, organism, sequence length, closest known structure, sequence identity to other cluster members, and domain boundaries for the TIM barrel domain obtained from SFLD. The interface allows searching for project datasets, organism groups, homologs based on sequence identity, and clusters of related sequences; the resulting sequences

can be flagged for rejection or inclusion into the final target list.

### Analysis of the target structures

The amidohydrolase and enolase superfamilies were annotated using computational tools. Cytoscape clustering gives an overview of how the targets are distributed across the superfamily [51]. Also, template-based modeling determines how many new sequences can be modeled with the new structural information [45].

# Sequence clustering of amidohydrolase superfamily by cytoscape

The time required to perfom BLAST searches against the NCBI non-redundant database (NR) of protein sequences [52] was prohibitive due to the size and complexity of the superfamily. Thus, a custom database was created containing only the amidohydrolase sequences in the SFLD. To generate the all-by-all connections for cytoscape clustering, BLAST searches were then performed against this database at an E-value cutoff of  $10^{-10}$ , using each sequence in the set as a query. Because this custom database contained only sequences known to be members of the amidohydrolase superfamily, the generation of E-values is biased. Consequently, the E-values from this analysis cannot be directly compared to those calculated by BLAST against the NCBI NR database. A cytoscape [51] network was created from these BLAST results. In the absence of established statistical techniques for selecting the E-value cutoff, we examined the superfamily networks at a number of different E-value cutoffs, and present here only one of the corresponding networks, at an E-value cutoff of  $10^{-10}$ . Further discussion regarding choosing and interpreting Evalue cutoffs for sequence similarity networks may be found in [53]. Each node in the network represents a single sequence and each edge represents the pairwise connection between two sequences with the most significant BLAST E-value (better than the cut-off) connecting the two sequences. Lengths of edges are not meaningful, except that sequences in tightly clustered groups are more similar to each other than sequences with few connections. The nodes were arranged using the yFiles organic layout provided in Cytoscape version 2.4. Tools for visualization of protein networks were created by the UCSF Resource for Biocomputing, Visualization, and Informatics (http:// www.rbvi.ucsf.edu).

# Sequence clustering of enolase superfamily by cytoscape

To generate the all-by-all connections for cytoscape clustering, BLAST analysis was performed against the NR database, using the sequences in the mandelate racemaselike, glucarate dehydratase-like, mannonate dehydrataselike, and muconate cycloisomerase-like subgroups of the SFLD enolase superfamily. The enolase subgroup was not included in this analysis. Almost all of the enolase subgroup members are in the enolase family, the sequences of which are all isofunctional, i.e. they all perform the wellcharacterized enolase reaction, important in glycolysis. Only hits in the aforementioned subgroups were used for further analysis. The cytoscape network was created as described above, but using an E-value cutoff for this superfamily of  $10^{-40}$ .

Table 1 List of 80 NYSGXRC genomes (as of June 2005)

Organism	Taxonomy ID	Organism	Taxonomy ID
Aeropyrum pernix	56636	Listeria monocytogenes	1639
Aquifex aeolicus	63363	Metagenome sequences (Gene synthesis)	256318
Arabidopsis thaliana	3702	Methanococcus jannaschi	2190
Archaeoglobus fulgidus	2234	Mus musculus	10090
Bacillus cereus	1396	Mycobacterium turberculosis H37Rv	83332
Bacillus halodurnas	86665	Mycoplasma pneumonia	2104
Bacillus subtilis	1423	Neisseria gonorrhoeae	485
Bacillus thuringiensis	1428	Neisseria meningitidis	487
Bartonella henselae	38323	Nostoc	1180
Bordetella pertussis	520	Oryctolagus cuniculus	9986
Borrelia burgdorferi	139	Oryza sativa	4530
Bos taurus	9913	Ovis aries	9940
Caenorhabditis elegans	6239	Porphyromonas gingivalis	837
Campylobacter jejuni	197	Pseudomonas aeruginosa	287
Candida albicans	5476	Pseudomonas putida	303
Canis familiaris	9615	Pyrococcus furiosus	2261
Capra hircus	9925	Pyrococcus horikoshii	53953
Caulobacter vibrioides	155892	Rattus norvegicus	10116
Clostridium acetobutylicum	1488	Rhodobacter sphaeroides	1063
Corynebacterium diphtheriae	1717	Saccharomyces cerevisiae	4932
Cryptococcus neoformans	5207	Salmonella typhimurium	602
Cryptosporidium parvum	5807	Schizosaccharomyces pombe	4896
Deinococcus radiodurans	1299	Shigella Flexneri type 2a	42897
Desulfovibrio vulgaris	881	Simian immunodeficiency virus	11723
Dictyostelium discoideum	44689	Staphylococcus aureus	1280
Drosophila melanogaster	7227	Staphylococcus epidermidis	1282
Enterobacter cloacae	550	Streptococcus mutans	1309
Enterococcus faecalis	1351	Streptococcus pneumoniae	1313
Equus caballus	9796	Streptococcus pyogenes	1314
Escherichia coli	562	Sulfolobus solfataricus	2287
Escherichia coli 0157:H7	83334	Sus scrofa	9823
Felis catus	9685	Takifugu rubripes	31033
Gallus gallus	9031	Thermoplasma acidophilum	2303
Haemophilus influenzae	727	Thermoplasma volcanium	50339
Halobacterium sp. NRC-1	64091	Thermotoga maritima	2336
Helicobacter pylori	210	Ureaplasma urealyticum	2130
Homo sapiens	9606	Vibrio cholerae	666
Human immunodeficiency virus type 1	11676	Xenopus laevis	8355
Klebsiella pneumoniae	573	Xylella fastidiosa	2371
Legionella pneumophila	446	Zea mays	4577

PDB code	Database accession number (Genpept GI IDs)	No of sequences in Psi-blast alignment	No of sequences with acceptable models and/or fold assignments	No of models >50% seq. ID (min 50% template coverage)	No of models 30-50% seq. ID (min 50% template coverage)	No of models <30% seq. ID (min 50% template coverage)	Subgroup assignment	Family assignment
Enolase super family	r family							
2GL5	16420812	2,863	2,777	0	98	2,462	Mandelate racemase-like	Galactonate dehydratase
2GDQ	2633433	2,234	2,129	1	0	2,036	Mandelate racemase-like	None
2GSH	16420830	2,588	2,286	16	6	2,110	Mandelate racemase-like	L-Fuconate dehydratase
2HNE	21115341	2,746	2,712	83	20	2,527	Mandelate racemase-like	None
2HZG	77386310	2,667	2,341	1	1	2,248	Mandelate racemase-like	None
215Q	15832389	2,566	2,340	21	13	2,206	Mandelate racemase-like	None
2NQL	17743914	2,849	2,470	2	1	2,356	Mandelate racemase-like	None
2056	16767118	3,016	2,968	15	127	2,735	Mandelate racemase-like	None
годн	21225834	2,690	2,668	2	32	2,630	Glucarate dehydratease-like	None
20QY	23100298	2,700	2,631	1	0	3,004	Muconate cycloisomerase-like	None
20VL	21221904	2,670	2,656	1	76	2,534	Mandelate racemase-like	None
20G9	91786345	2,669	2,664	10	75	2,553	Mandelate racemase-like	L-Talarate/galactarate dehydratase
20LA	88195610	2,719	2,697	5	3	2,652	Muconate cycloisomerase-like	o-Succinylbenzoate synthase
2006	91778214	3,271	3,221	3	2	3,111	Mandelate racemase-like	None
20KT	57650581	2,723	2,705	5	З	2,664	Muconate cycloisomerase-like	o-Succinylbenzoate synthase
20PJ	72161814	2,562	1,855	19	31	1,712	Mandelate racemase-like	o-Succinylbenzoate synthase
20X4	56552160	2,733	2,639	11	136	2,449	Mandelate racemase-like	None
20Z3	67154209	2,743	2,656	38	25	2,567	Mandelate racemase-like	None
20Z8	13475907	2,821	2,674	0	0	2,641	Mandelate racemase-like	None
2POI	46136735	2,747	2,661	13	52	2561	Mandelate racemase-like	None
20ZT	22294898	2,816	2,726	0	16	2,722	Muconate cycloisomerase-like	o-Succinylbenzoate synthase
2PCE	83951697	2,693	2,683	1	16	2,635	Muconate cycloisomerase-like	None
2PGE	51244103	2,779	2,767	1	19	2,768	Muconate cycloisomerase-like	o-Succinylbenzoate synthase
2PGW	16263250	2,781	2,743	1	3	2,694	Mandelate racemase-like	None
2PMQ	114764387	2,881	2,760	3	14	2,723	Muconate cycloisomerase-like	None
2POD	53723090	2,745	2,732	12	97	2,585	Mandelate racemase-like	Galactonate dehydratase
2POZ	13488170	2,861	2,836	1	162	2,687	Mandelate racemase-like	None
2PPG	16262827	2,947	2,755	2	66	2,707	Mandelate racemase-like	None
2PS2	83774494	2,777	2,753	3	16	2,712	Muconate cycloisomerase-like	None
2QDE	56478643	2,930	2,670	1	62	2,595	Muconate cycloisomerase-like	None
2QGY	110347373	2,988	2,899	0	1	2,912	Mandelate racemase-like	None
2006	108803396	3,238	3,216	0	201	3,081	Mandelate racemase-like	Galactonate dehydratase
2.0YE	83951695	3 178	3 171	0	5	0110	Mussuets and disconcess like	N

PDB code	Database accession number (Genpept GI IDs)	No of sequences in Psi-blast alignment	No of sequences with acceptable models and/or fold assignments	No of models >50% seq. ID (min 50% template coverage)	No of models 30–50% seq. ID (min 50% template coverage)	No of models <30% seq. ID (min 50% template coverage)	Subgroup assignment	Family assignment
3BJS	6791043	3,261	2,897	4	82	2,810	Mandelate racemase-like	None
2QDD	83951694	2,868	2,852	0	20	2,849	Muconate cycloisomerase-like	o-Succinylbenzoate synthase
3CAW	42522147	2,220	2,139	0	0	2,137	Muconate cycloisomerase-like	o-Succinylbenzoate synthase
3CT2	70731221	3,483	2,771	84	77	2,667	Muconate cycloisomerase-like	Muconate cycloisomerase
3CYJ	108805509	3,551	2,879	8	35	2,838	Mandelate racemase-like	None
3DDM	33575875	3,603	3,576	9	27	3,591	Mandelate racemase-like	None
3BSM	92115090	3,372	3,359	86	165	3,097	Mannonate dehydratase-like	Mannonate dehydratase
Total (unique sequences)	sequences)	7,013	5,804	398	766	5,190		
midohydrola	Amidohydrolase superfamily							
2GOK	17742376	3,001	2,943	96	103	2,678	Imidazolonepropionase-like	Imidazolonepropionase
200D	27378991	3,609	3,572	0	160	3,440	Guanine deaminase-like	None
200F	83646866	3,588	3,578	142	154	3,270	Imidazolonepropionase-like	Imidazolonepropionase
215G	9951721	569	448	28	50	340	None	None
219U	15023121	3,386	3,363	5	96	3,198	Newfam59	None
2ICS	29342885	3,433	3,334	6	28	3,209	Unknown18	None
2IMR	9911007	3,790	3,502	1	3	3,498	None	None
20GJ	17741648	3,527	3,510	5	18	3,395	Newfam71	None
2P9B	23466009	3,319	3,302	2	37	3,230	Unknown41	None
2PAJ	91783796	3,264	3,252	4	116	3,128	Unknown55	None
2001	13422863	460	263	35	14	172	Uronate isomerase-like	Uronate isomerase
2Q6B	15615056	306	189	.0	0	167	Uronate isomerase-like	Uronate isomerase
2QS8	114773165	3,508	3,497	15	144	3,280	Unknown43	None
2QT3	32455889	3,723	3,693	1	49	3,606	Unknown95	None
2RAG	16126978	911	602	7	53	502	Newfam32	None
2R8C	4447959	3,649	3,632	19	195	3,359	Unknown47	None
219U	150231121	3,386	3,363	5	96	3,198	Newfam59	None
200F	83646866	3,588	3,578	142	154	3,270	Imidazolonepropinase-like	Imidazolonepropionase
3B40	9948434	1, 149	656	16	34	504	Newfam190	None
3CJP	15896580	3,289	3,286	1	1,467	1,851	Newfam63	None
3BE7	4436882	3,697	3,198	4	112	3,042	Unknown42	None
Total (unique sequences)	sequences)	12,101	11,628	302	2,429	8,912		

# Template-based modeling by MODWEB

Automated comparative modeling of all known protein sequences using the new NYSGXRC crystallographic structures as templates was performed with MODWEB [45]. We relied on the MODWEB option that allows using a protein structure as input and results in models for all of the identifiable sequence homologs of the input structure from the NCBI NR database; these homologs were identified during ten PSI-BLAST iterations of the template sequence against NR (E-value cutoff is 0.0001). The results are available at http://salilab.org/modbase/models\_nysgxrc\_ latest.html (Table 2).

# **Results and discussion**

We first present the results of the target selection procedure. We also describe the current snapshot of the progress of the targets through our structural genomics pipeline (June 2008). We then indicate how the resulting crystallographic structures are distributed across the two superfamilies. Next, we determine the number of protein sequences in the comprehensive sequence databases that are detectably related to these protein structures (i.e., the modeling leverage). Finally, for each of the two superfamilies, we describe an example target with interesting biological features.

### Target selection

Given the capacities of ENSPEC and NYSGXRC, the goal was to identify approximately 500 target sequences, approximately evenly distributed between the two superfamilies. These targets were obtained by selecting representatives from previously identified superfamily members as well as by identifying new superfamily members in a select set of genomes (Materials and Methods).

# Targets for the amidohydrolase superfamily

From the SFLD, we obtained a list of 3,701 amidohydrolase superfamily members. The first filtering step resulted in 1,918 sequences with less than 30% sequence identity to a known structure and at least 250 amino acid residues in length, originating from 424 organisms. We chose the 30% sequence identity limit, in congruence with NIH PSI guidelines, to concentrate our efforts on protein sequences with limited structural knowledge; sequences related at less than 30% sequence identity to the closest known structure are frequently modeled inaccurately due to errors in the corresponding target-template alignments [54–56].

These 1,918 sequences were further filtered manually using the target selection tool to obtain the reduced set of

224 target sequences. The selected amidohydrolase superfamily members are evenly distributed among the various clades of the superfamily, thus representing the diversity within the superfamily. Preference was given to the NY-SGXRC genomes, but other organisms were also considered.

The 224 targets can be divided into 76 clusters with less than 30% sequence identity between any pair of sequences from two different clusters, 126 clusters at 50% sequence identity, and 177 clusters at 80% sequence identity. The amidohydrolase superfamily members all contain the defining conserved TIM barrel domain with some variation in their lengths; all targets are between 224 and 628 amino acid residues long, with 90% of them shorter than 500 residues. The length variation stems mostly from loops that connect the main secondary structure elements of the TIM barrel fold and is consistent with the previously observed size range for TIM barrel domains (150 to 500 residues [57]).

In addition to the known superfamily members, the sequence- and structure-based expansions detected 63 putative amidohydrolase superfamily members that were not initially in the SFLD (Table 3). These new potential targets fall into two categories: (i) divergent sequences that were detected by the sequence-based approach (Fig. 1, blue box) and (ii) divergent sequences that were detected by the structure-based approach (Fig. 1, orange box). Of the 63 putative amidohydrolase superfamily sequences, 50 were subsequently verified using the SFLD update procedure. The presence of probable catalytic residues for the remaining 13 targets was verified manually. Nine of these 13 sequences were detected by both the sequence- and structure-based approaches, and four sequences were only detected by the structure-based approach. Thus, the sequence- and structure-based approaches yielded 13 additional targets that could not be identified as amidohydrolase superfamily members using previously available protocols (corresponding to 21% of the new putative members of the amidohydrolase superfamily).

In summary, the final amidohydrolase target list includes 224 previously identified amidohydrolase superfamily members, as well as the 63 newly identified sequences. The final list includes 287 sequences from 53 organisms that cover 22 (61%) of the named families in the superfamily (Fig. 2).

# Targets for the enolase superfamily

We used a simpler selection scheme for the enolase superfamily members, because previous detailed studies have effectively found all of the superfamily members in publicly available sequence and structure databases (data not shown). Of the 1,795 sequences already established as enolase superfamily members, we selected as targets the

# Table 3 Putative amidohydrolase superfamily members

Database ID (GenPept GI IDs)	Method	Organism	Length	Annotation available at target selection	Verification
7462218	Structure-based	Thermotoga maritima	434	Conserved hypothetical protein	HMM
7497374	Structure-based	Caenorhabditis elegans	818	Hypothetical protein C44B7.10	HMM
7500805	Structure-based	Caenorhabditis elegans	313	T21966 hypothetical protein F38E11.3— <i>Caenorhabditis elegans</i>	HMM
9948434	Structure-based	Pseudomonas aeruginosa PAO1	448	Probable dipeptidase precursor ( <i>Pseudomonas aeruginosa</i> )	HMM
10173106	Structure-based	Bacillus halodurans	427	BH0493	HMM
10175729	Structure-based	Bacillus halodurans	571	DNA-dependent DNA polymerase beta chain	HMM
13700943	Structure-based	Staphylococcus aureus subsp. aureus N315	570	DNA-dependent DNA polymerase beta chain	HMM
14600641	Structure-based	Aeropyrum pernix	313	313aa long hypothetical microsomal dipeptidase	HMM
14601853	Template	Aeropyrum pernix	394	Hypothetical protein (Aeropyrum pernix)	HMM
14602106	Structure-based	Aeropyrum pernix	327	Hypothetical protein (Aeropyrum pernix)	HMM
15600589	Structure-based	Pseudomonas aeruginosa PAO1	325	D82971 hypothetical protein PA5396 (imported)— <i>Pseudomonas aeruginosa</i> (strain PAO1)	НММ
15612748	Structure-based	Bacillus halodurans	448	BH0185	HMM
15614834	Structure-based	Bacillus halodurans	310	Dipeptidase	HMM
15791917	Structure-based	Campylobacter jejuni subsp. jejuni NCTC	265	Hypothetical protein Cj0556	HMM
15805850	Structure-based	Deinococcus radiodurans R1	418	Hydrolase, putative	HMM
15896580	Structure-based	Clostridium acetobutylicum	262	Predicted amidohydrolase (dihydroorotase family)	HMM
15898656	Structure-based	Sulfolobus solfataricus	314	Microsomal dipeptidase	HMM
15925570	Structure-based	Staphylococcus aureus subsp. aureus N315	336	Conserved hypothetical protein	HMM
16125737	Structure-based	Caulobacter vibrioides	487	Uronate isomerase (EC 5.3.1.12) (Glucuronate isomerase) (UronicDE isomerase)	HMM
16126978	Structure-based	Caulobacter vibrioides	417	Dipeptidase	HMM
16127409	Structure-based	Caulobacter vibrioides	353	Hypothetical protein	HMM
16130781	Structure-based	Escherichia coli K12	464	Soluble protein involved in cell viability at the beginning of stationary phase; soluble protein involved in cell viability at the beginning of stationary phase, contains urease domain	НММ
16410647	Structure-based	Listeria monocytogenes EGD-e	570	lmo1231	HMM
17556402	Structure-based	Caenorhabditis elegans	352	Hypothetical protein Y71D11A.3a	HMM
19705473	Structure-based	Rattus norvegicus	336	2-amino-3-carboxymuconate-6-semialdehyde decarboxylase	HMM
19911227	Structure-based	Homo sapiens	336	2-amino-3-carboxylmuconate-6-semialdehyde decarboxylase	HMM
19911231	Structure-based	Caenorhabditis elegans	401	2-amino-3-carboxylmuconate-6-semialdehyde decarboxylase	HMM
24379660	Structure-based	Streptococcus mutans UA159	267	conserved hypothetical protein	HMM
33592291	Structure-based	Bordetella pertussis Tohama I	284	Putative 2-pyrone-4,6-dicarboxylic acid hydrolase	HMM
33593502	Structure-based	Bordetella pertussis Tohama I	341	Putative dipeptidase	HMM
39976001	Sequence- and structure-based	Magnaporthe grisea 70–15	417	Hypothetical protein	HMM

23093239

25009707

33593596

40744823

47678365

49116836

structure-based

Sequence-based

Sequence-based

Structure-based

Structure-based

Sequence-based

Sequence- and

structure-based

### Table 3 continued

Database ID (GenPept GI IDs)	Method	Organism	Length	Annotation available at target selection	Verification
42527610	Structure-based	Treponema denticola ATCC 35405	371	Dihydroorotase, putative	HMM
42631159	Structure-based	Haemophilus influenzae	330	Hypothetical protein	HMM
51012913	Structure-based	Saccharomyces cerevisiae	313	YMR262W	HMM
51968376	Structure-based	Arabidopsis thaliana	346	Unnamed protein product	HMM
51968996	Structure-based	Arabidopsis thaliana	346	Unnamed protein product	HMM
55980841	Structure-based	Thermus thermophilus HB8	369	Amidohydrolase family protein	HMM
60279993	STRUCTURE-based	Pseudomonas aeruginosa	403	PvdM HMM	
6807941	Structure-based	Dictyostelium discoideum	359	Hypothetical protein	HMM
6808659	Structure-based	Dictyostelium discoideum	322	Hypothetical protein	HMM
.065989	Sequence-based	Bacillus subtilis subsp. subtilis str. 1	577	Adenine deaminase	HMM
5023784	Sequence-based	Clostridium acetobutylicum	570	Adenine deaminase	HMM
4636152	Structure-based	Caenorhabditis elegans	403	Hypothetical protein C44B7.12	HMM
9377069	Structure-based	Enterococcus faecalis V583	444	Chlorohydrolase family protein	HMM
40788915	Structure-based	Homo sapiens	777	Q93075_chr3:10265710- 10295706_H233R_V272I_L374P PUTATIVE DEOXYRIBONUCLEASE KIAA0218 (EC 3.1.21)	HMM
5446932	Sequence- and structure-based	Drosophila melanogaster	774	CG32626-PA, isoform A	HMM
56203368	Sequence- and structure-based	Homo sapiens	776	Adenosine monophosphate deaminase 1 (isoform M	HMM
6203369	Sequence-based	Homo sapiens	780	OTTHUMP00000059283	HMM
7230710	Structure-based	Filobasidiella neoformans	469	Hydrolase, putative	HMM
3055053	Structure-based	Homo sapiens	761	TatD DNase domain containing 2	HMM
68250266	Structure-based	Haemophilus influenzae	251	Conserved putative deoxyribonuclease	HMM
129129	Sequence-based	Saccharomyces cerevisiae	797	YB9Z_YEAST HYPOTHETICAL 92.9 KD PROTEIN IN SSH1-APE3 INTERGENIC REGION	Manual
293948	Sequence-based	Drosophila melanogaster	520	CG5998-PA	Manual
1463854	Sequence-based	Drosophila melanogaster	561	Male-specific IDGF	manual
4602062	Structure-based	Aeropyrum pernix	375	Hypothetical protein [Aeropyrum pernix]	Manual
5898896	Structure-based	Sulfolobus solfataricus	269	Conserved hypothetical protein	Manual
6264026	Template	Sinorhizobium meliloti	466	HYPOTHETICAL PROTEIN	Manual
7646150	Sequence- and	Drosophila melanogaster	506	Adenosine deaminase-related growth factor C	Manual

Tables listing all amidohydrolase and enolase superfamily targets can be found at http://salilab.org/projects/enspec/ (HMM Hidden Markov Model verification)

561

561

523

511

510

Drosophila melanogaster

Drosophila melanogaster

Aspergillus nidulans FGSC 562

Bordetella pertussis

Tohama I

Homo sapiens

Xenopus laevis

A4

CG32178-PA

Conserved hypothetical protein

Cat eye syndrome critical region

protein 1 [Homo sapiens]

HYPOTHETICAL protein

Hypothetical protein

AT05468p

Manual

Manual

Manual

Manual

Manual

Manual

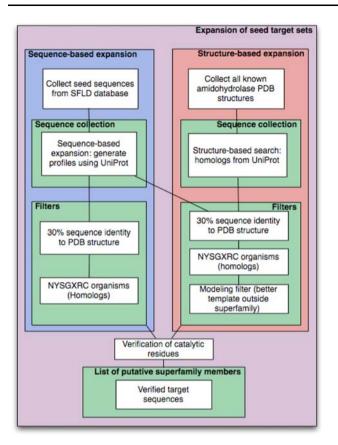


Fig. 1 Flowchart of the target expansion strategy of sequence-based target expansion (left) and structure-based target expansion (right)

255 sequences with less than 30% sequence identity to a known structure over at least 250 residues in length, originating from 98 organisms. These targets form 74 clusters at the 30% sequence identity cutoff, 126 clusters at 50% sequence identity, and 196 clusters at 80% sequence identity. The length distribution is 200 to 656 amino acid residues, with 90% of the sequences between 200 and 405 residues in length.

A complete list of the selected amidohydrolase and enolase superfamily targets can be found at http://salilab. org/projects/enspec/.

# Structural genomics pipeline attrition

To date, 254 amidohydrolase (88%) and 206 enolase (80%) superfamily members have been attempted using the NYSGXRC/ENSPEC X-ray crystallographic structure determination pipeline. Progress to date and attrition rate at each stage of the pipeline are documented in Table 4 (June 2008). The project has not yet been completed, and a number of targets are still progressing through the pipeline. Also, a few targets in the target list have not yet been entered in the experimental pipeline. Therefore, the final overall success rate should be higher than that presented in

Table 4. Experimental results for all NYSGXRC Community-nominated targets are updated weekly in PepcDB (http://pepcdb.pdb.org/).

Clear trends are observed in the success rates of crystallization and subsequent crystallographic structure determination for the amidohydrolase and enolase superfamily members. While only 38% of the purified targets were members of the enolase superfamily, they comprise 67% of the unique experimental structures. If crystals are obtained for an enolase superfamily member, there is a good chance that its structure will be successfully determined. On the other hand, for at least a quarter of the amidohydrolase proteins, we observed unusually broad peaks in the electrospray ionization (ESI) mass spectra of the intact proteins, indicative of heterogeneity in the preparation. Proteolytic digestion followed by tandem mass spectrometry analysis was carried out on the heterogeneous proteins; multiple sites of oxidation and methylation were identified with 90% of the protein sequence typically identified. These modifications were the source of the sample heterogeneity, and thus one reason for the limited success in obtaining usable crystallographic datasets from crystals of these amidohydrolases.

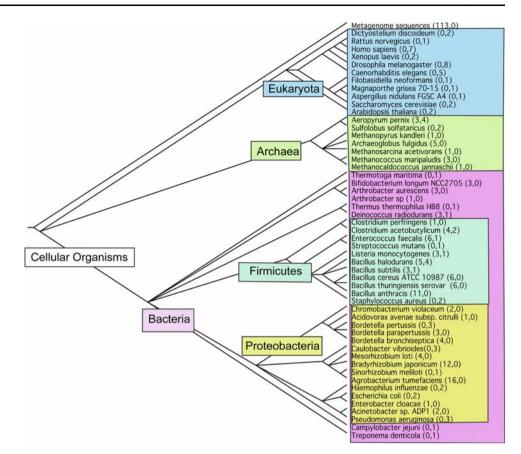
Of structural and functional interest was the fact that the oxidation sites were primarily located at histidine residues adjacent to  $Fe^{2+}$  ions in the presumed active sites of the amidohydrolases. Excess oxidation can be avoided using an alternate expression system (e.g. baculovirus) or adding excess  $Mn^{2+}$  and an iron chelator such as 2,2'-dipyridyl prior to induction during *E. coli* expression. In contrast, oxidation was not been observed in members of the enolase superfamily, since these proteins bind only a divalent metal ion such as  $Mg^{2+}$  or  $Mn^{2+}$  and not iron.

Analysis of the resulting crystallographic structures

# Leverage of new crystallographic structures by modeling

To determine the impact of a structure on the structural mapping of the protein sequence space, we determine how many known protein sequences can be modeled based on the structure (i.e., the modeling leverage) (Table 2). Each enolase structure is a useful template for calculating comparative models for 2,500 to 3,200 other protein sequences in the NR database; a template is considered useful when the resulting model is based on a significant PSI-BLAST E-value (0.0001) or a favorable GA341 model score (>0.7). In contrast, the amidohydrolase superfamily structures fall into two categories: most are detectably related to 3,000–3,800 other proteins, but five structures (PDB Codes: 215G, 2Q01, 2Q6E, 2RAG, and 3B40) are related to a significantly smaller number of sequences (approximately 300–1,000).

Fig. 2 Phylogenetic tree of the organisms for the selected amidohydrolase targets. The numbers in parentheses represent the number of targets for confirmed (first number) and putative (second number) amidohydrolase superfamily members. The tree was generated using the NCBI Taxonomy Browser [61]



A comparison of these numbers to the template-based modeling results for all NYSGXRC structures as of May 2007 (Table 5) shows that the average number of models per structure is significantly higher for the amidohydrolase and enolase superfamilies than for all structures determined by NYSGXRC (2,681 vs. 1,964). This difference reflects the relatively large sizes of the amidohydrolase and enolase

 
 Table 4
 Success rates for the steps in the structural genomics pipeline as of June 2008

Step	Amidohydrolase superfamily		Enolas superf		Both superfamilies	
	Total	Fraction (%)	Total	Fraction (%)	Total	Fraction (%)
In pipeline	279		222		501	
Cloned	254	91	206	93	460	92
Expressed	225	88	177	86	402	87
Soluble	167	74	112	63	279	69
Purified	110	66	67	60	177	63
Crystallized	63	57	44	66	107	60
Unique structures	20	32	41	93	61	57
All structures	25		50		75	

superfamilies; according to the Superfamily database (http://supfam.org, [58]), across all of the superfamilies in the database, there are on average 1,770 protein sequences per superfamily.

Breaking down the modeling leverage by sequence identity reveals that the modeling leverage for the amidohydrolase and enolase superfamily structures is higher and lower than that for all NYSGXRC structures below and above the sequence identity cutoff of 30%, respectively. These differences are likely due in part to the relatively high diversity in the amidohydrolase and enolase superfamilies.

Upon initiation of the ENSPEC/NYSGXRC effort in June 2005, 45% of all known members of the amidohydrolase and enolase superfamilies were related to a known structure with a sequence identity higher than 30%. Due to the increased number of templates from the amidohydrolase and enolase superfamilies contributed by our consortia, this number increased to from 45% to 73%.

The total number of unique sequences modeled using the new amidohydrolase and enolase superfamily structures is 11,097, approximately 30% more than the number of known sequences from the amidohydrolase and enolase superfamilies. Among these additional sequences, we expect both members of other superfamilies with the TIM

	Amidohydrol members	ase and enolase superfamily	All
Average number of sequences with acceptable models	2,681		1,964
Minimum/maximum number of sequences with acceptable models	189/3693		30/6320
Average number of sequences with $>50\%$ sequence identity, at least 50% coverage	15		20
Average number of sequences with 30-50% sequence identity, at least 50% coverage	59		113
Average number of sequences with ${<}30\%$ sequence identity, at least 50% coverage	2,572		1,400

 Table 5
 Comparison of template-based modeling statistics for the 61 ENSPEC/NYSGXRC structures and all 327 NYSGXRC structures (May 2007)

An acceptable model is defined to be based on a significant PSI-BLAST E-value (0.0001) or a favorable GA341 model score (>0.7)

barrel fold, as well as currently unidentified members of the amidohydrolase and enolase superfamilies, because the sequence databases have been growing by approximately 50% since 2005, and also because we concentrated on selecting only targets from the NYSGXRC genomes in the target selection process for this project.

Distribution of targets over the amidohydrolase and enolase superfamilies

For large groups of related sequences, such as the amidohydrolase superfamily network-based visualization of their relationships is helpful in generating hypotheses about how various enzymes in the superfamily evolved, and on how closely the subgroups are related to each other. We have plotted cytoscape networks for the amidohydrolase and enolase superfamilies, based on clustering by sequence similarity, and marked previously known structures, and the final targets and the structures from this project (Fig. 3). For clarity, we circled a few distinct subgroups. Another network representation with all sub-group assignments can be found in the supplemental materials.

Many subgroups in the large amidohydrolase superfamily, such as the urease-like subgroup and the uronate isomerase-like subgroup, are distinctly separated from the other superfamily members. This separation can most simply be interpreted as the result of the extreme divergence of these subgroups; thus, they are "outliers" in the overall context of the superfamily (see below for further discussion of this subgroup).

Four of the five divergent amidohydrolase structures with a considerably smaller number of homologs are separated from the main amidohydrolase network, even at the relatively non-stringent E-value cut-off of  $10^{-10}$  required to visualize connections between nodes. Two of them (2Q01, 2Q6E) belong to the uronate isomerase-like subgroup. Another two of these structures (2RAG, 3B40) are clustered together with a number of unclassified sequences

as well as several membrane dipeptidase-like amidohydrolase superfamily members, possibly indicating that these targets are additional members of the membrane dipeptidase subgroup. This subgroup membership is also supported by their annotation as putative dipeptidases in UniProt.

For the enolase superfamily, we chose to generate a cytoscape network that represents only four subgroups, containing the majority of the targets. The targets were mostly chosen from the mandelate racemase-like subgroup, because it is the largest subgroup with little previous structural coverage, and from the more divergent muconate cycloisomerase subgroup. The cytoscape networks illustrate that the targets and the resulting structures are indeed concentrated in regions of superfamily sequence space that lacked structural characterization prior to the start of the project, as desired for our target selection.

Examples of biological impact resulting from new structures obtained in this study

# Amidohydrolase superfamily example: atypical uronate isomerase Bh0493

The enzymes in the uronate isomerase family are members of the amidohydrolase superfamily, although they are extremely diverged from other clusters of the amidohydrolase superfamily network (Fig. 3a). Target 9247a (gi 10173106, Bh0493) from *Bacillus halodurans* was identified by our structure-based expansion as a putative member of the amidohydrolase superfamily and has recently been experimentally confirmed as a uronate isomerase [29]. In most organisms, both glucuronic acid and galacturonic acid are first isomerized by a single uronate isomerase, followed by further modification by several sugar specific dehydrogenases and dehydratases. In *B. halodurans*, as in several other organisms, two uronate isomerase genes are found, in

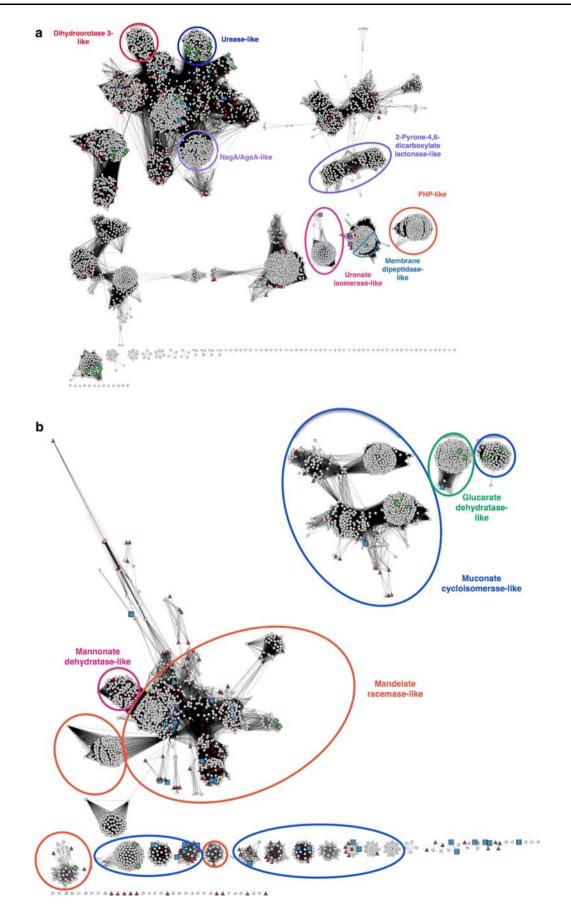
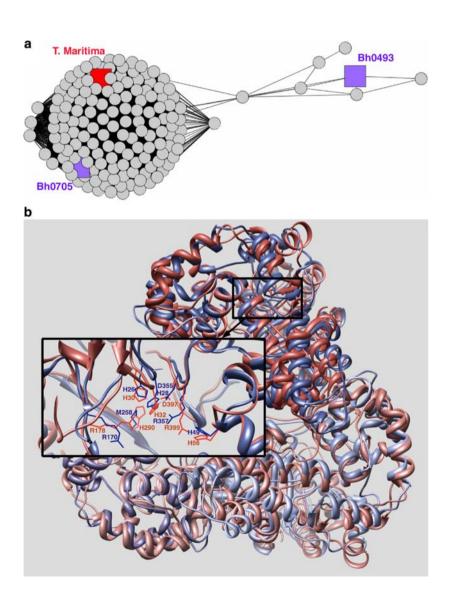


Fig. 3 a Cytoscape clustering for the amidohydrolase superfamily. The most homogeneous subgroups have been named. An additional figure with full subgroup coloring is available in Supplemental Materials. Green diamonds Structures determined prior to the start of the ENSPEC/NYSGXRC project in June 2005. Red triangles Superfamily members in the target list. Purple squares Five divergent structures determined by ENSPEC/NYSGXRC. Blue squares All other structures determined by ENSPEC/NYSGXRC. Ovals indicate subgroups: red dihydroorotase 3-like; dark blue urease-like; purple NagA/AgaA-like; light-blue: 2-Pyrone-4,6-dicarboxylate lactonaselike; pink uronate-isomerase-like; orange PHP-like; delft-blue membrane dipeptidase-like. b Cytoscape clustering for the enolase superfamily. Subgroup clusters are marked for four subgroups. The full subgroup assignments can be found in Supplemental Materials. Green diamonds Structures determined prior to the start of the ENSPEC/NYSGXRC project in June 2005. Red triangles Superfamily members in the target list. Blue squares All structures determined by ENSPEC/NYSGXRC. Ovals indicate subgroups: pink mannonate dehydratase-like; orange mandelate racemase-like; blue muconate cycloisomerase-like; green glucarate dehydratase-like

operons containing dehydrogenase as well as dehydratase enzymes, consistent with this assignment of activity. We characterized both uronate isomerase genes, a "typical" uronate isomerase, Bh0705, and Bh0493, an "outlier" relative to other characterized members of this family (Fig. 4a). Although the results showed that each enzyme can isomerize both substrates, galacturonate and glucuronate, the Bh0705 uronate isomerase preferentially isomerizes glucuronic acid (approximately 100 times faster than galacturonic acid). In contrast, Bh0493 isomerizes glucuronic acid and galacturonic acid almost equally efficiently. These observations indicate that in *B. halodurans*, the "typical" uronate isomerase (Bh0705) has specialized its catalytic activity to preferentially isomerize glucuronic acid, perhaps because the isomerization of galacturonic acid is sufficiently achieved by Bh0493.

Fig. 4 a Cytoscape network showing the uronate isomerase family. The E-value threshold for displaying edges is  $10^{-10}$ . The large cluster represents the "typical" uronate isomerases; sequences in this cluster are more similar to other members of the amidohydrolase superfamily than is Bh0493. Bh0705 is shown in purple and the structurally characterized enzyme from Thermotoga maritima is shown in red. On the right, the outlier uronate isomerase, Bh0493, is shown in purple along with a small number of sequences of unknown function. b Ribbon diagram [62] of a superposition of the trimeric structures of Bh0493 (2Q6E, blue) and a uronate isomerase from Thermotoga maritima (1J5S, red). The detailed box shows the active site residues of chain A including a Zn<sup>2+</sup> ion for 2Q6E



To gain further insight into the structural differences between Bh0493 and the "typical" uronate isomerases (and between uronate isomerases and other members of the amidohydrolase superfamily), and in the absence of a structure of Bh0705, we compared the structure of Bh0493 (PDB codes 2Q08 and 2Q6E) to another "typical" uronate isomerase from Thermotoga maritima (PDB code 1J5S). As shown in Fig. 4b, the functionally important residues Arg170, Arg357 and His49, are conserved and cluster together within the enzyme active site both in the T. maritima enzyme and Bh0493. However, an additional metal-coordinating histidine that is usually found at the end of  $\beta$ -strand five in "typical" uronate isomerases (H290 in the 1J5S) is missing in Bh0493, which has a Met (M258) in that position. The  $Zn^{2+}$  ion is coordinated by two histidine residues (His28 and His26) plus Asp355. Guided by these structures, further biochemical and computational studies to examine the differences between these two types of uronate isomerases, and how they may be related to their different specificities, are currently in progress.

# Enolase superfamily example: mandelate racemase subgroup

The SFLD currently describes 17 different families in the enolase superfamily, each performing a different overall reaction associated with different substrates and products. For the approximately 50% of the superfamily sequences whose functions are yet unknown, we estimate that roughly 15-20 novel functions (i.e. new families) will be identified. Across the superfamily, the sequences whose functions are not yet identified can be clustered into three primary subgroups and several smaller ones based on sequence and structural differences, including differences in the constellations of active site residues involved in binding specificity and catalysis [10]. In the mandelate racemase subgroup, most of the enzymes with characterized reactions are dehydratases acting on acid sugars, with the "outlier" enzyme being mandelate racemase itself. All structurally characterized members of the subgroup can be distinguished by a His-Asp dyad at the ends of  $\beta$ -strands six and seven that is associated with proton abstraction of substrates in the R-configuration [59]. Mandelate racemase and several acid sugar dehydratases that were previously structurally and functionally characterized also have a conserved Lys-X-Lys motif on  $\beta$ -strand two, with the second Lys in this motif involved in proton abstraction of substrates in the S-configuration [42]. Within this subgroup, we also observe divergence in this motif among several members of both known [32] and unknown function.

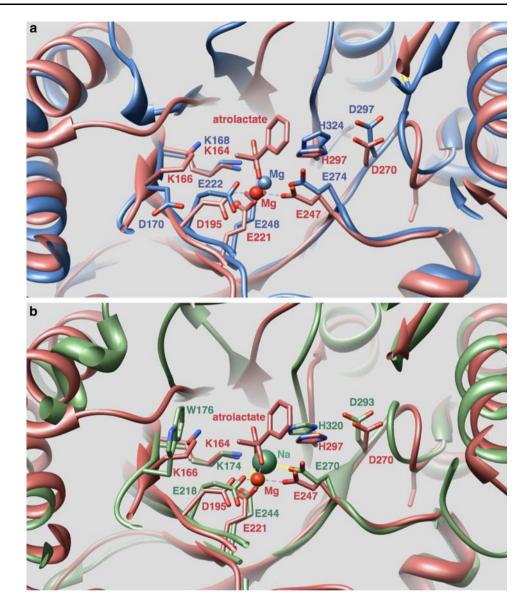
Three members of the mandelate racemase subgroup whose structures were determined by NYSGXRC, 2GL5 and 2056 from Salmonella typhimurium and 20X4 from Zymomonas mobilis, were found to have a Lys-Val-Asp sequence motif at this position, possibly indicating a different catalytic mechanism or yet other novel function(s). The three structures align within 50% sequence identity to each other. The next closest structures (30% sequence identity) are also members of the mandelate racemase subgroup: 2POZ from Mesorhizobium loti and 2POD from Burkholderia pseudomallei have Lys-Phe-Tyr and Lys-Ile-Trp motifs at this position, respectively, providing further evidence for divergent catalytic function(s). Their structures reveal details of differences relative to that of well-characterized subgroup members containing a "canonical" Lys-X-Lys motif, providing information expected to be useful in identifying their functions. Figure 5 shows superpositions of mandelate racemase with 2GL5 and 2POD, illustrating the differences in this motif. Guided by these new structures, these enzymes are now being further analyzed computationally and experimentally.

# Conclusion

The Enzyme Specificity Consortium and the New York SGX Research Center for Structural Genomics made significant progress towards characterizing the structures and functions in the amidohydrolase and enolase superfamilies. New members of the amidohydrolase superfamily have been identified through a combination of sequence- and structure-based expansions of the pool of known super-family members. The structure-based expansion was particularly successful in identifying previously unrecognized superfamily members. The 63 crystallographic structures from the structural genomics pipeline increased the fraction of the sequences in these two superfamilies that can be modeled based on at least 30% sequence identity from 45% to 73%.

As an annotation tool for the targets in the two superfamilies, template-based modeling of all sequences that had detectable homology to a known structure in the amidohydrolase or enolase superfamily allowed us to suggest previously un-annotated amidohydrolase sequences, several of which were subsequently verified by experiment, as shown for Bh0493 in this paper. This demonstrates the power of combining sequencestructure-based approaches for the and structural genomics of two large and diverse enzyme superfamilies.

Fig. 5 Mandelate racemase bound to a substrate analog, atrolactate, (1MDR: red), is shown superimposed with two structures of unknown function. In both superpositions, active site metal ligands D195, E221, E247, the active site His-Asp dyad (H297, D270), and a Lys-X-Lys motif (K164, K166) conserved in 1MDR and other members of the mandelate racemase subgroup are labeled (1MDR numbering). a Superposition of 2GL5 (blue) with 1MDR shows conservation of all of these active site residues, except for the second Lys in the Lys-X-Lys motif of 1MDR, which is replaced in 2GL5 by Asp170. This residue faces away from the active site in 2GL5. b Superposition of 2POD (green) with 1MDR also shows conservation of all of listed residues, except for the second Lys in the Lys-X-Lys motif that is replaced in 2POD by W176



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