

Amino acid function relates to its embedded protein microenvironment: A study on disulfide-bridged cystine

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ABSTRACT

In our previous study, we have shown that the microenvironments around conserved amino acids are also conserved in protein families (Bandyopadhyay and Mehler, *Proteins* 2008; 72:646–659). In this study, we have hypothesized that amino acids perform similar functions when embedded in a certain type of protein microenvironment. We have tested this hypothesis on the microenvironments around disulfide-bridged cysteines from high-resolution protein crystal structures. Although such cystines mainly play structural role in proteins, in certain enzymes they participate in catalysis and redox reactions. We have performed and report a functional annotation of enzymatically active cystines to their respective microenvironments. Three protein microenvironment clusters were identified: (i) buried-hydrophobic, (ii) exposed-hydrophilic, and (iii) buried-hydrophilic. The buried-hydrophobic cluster encompasses a small group of 22 redox-active cystines, mostly in alpha-helical conformations in a –C-x-x-C– motif from the Oxido-reductase enzyme class. All these cystines have high strain energy and near identical microenvironments. Most of the active cystines in hydrolase enzyme class belong to buried hydrophilic microenvironment cluster. In total there are 34 half-cystines detected in buried hydrophilic cluster from hydrolases, as a part of enzyme active site. Even within the buried hydrophilic cluster, there is clear separation of active half-cystines between surface exposed part of the protein and protein interior. Half-cystines toward the surface exposed region are higher in number compared to those in protein interior. Apart from cystines at the active sites of the enzymes, many more half-cystines were detected in buried hydrophilic cluster those are part of the microenvironment of enzyme active sites. However, no active half-cystines were detected in extremely hydrophilic microenvironment cluster, that is, exposed hydrophilic cluster, indicating that total exposure of cystine toward the solvent is not favored for enzymatic reactions. Although half-cystines in exposed-hydrophilic clusters occasionally stabilize enzyme active sites, as a part of their microenvironments. Analysis performed in this work revealed that cystines as a part of active sites in specific enzyme families or folds share very similar protein microenvironment regions, despite of their dissimilarity in protein sequences and position specific sequence conservations.

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Key words: amino acid function; embedded protein microenvironment; disulphide bridged cystine; half-cystine; redox active cystine; enzyme class; enzyme active site; protein microenvironment cluster; protein dielectric medium; sequence conservation.

INTRODUCTION

Properties of amino acids are influenced by the surrounding dielectric medium, like water/octanol,¹ protein interior^{2–4} and membrane bilayers.^{5–8} The protein interior is highly heterogeneous in terms of its dielectric medium; the environment created by the complex mosaic of 20 different amino acids. This heterogeneous protein dielectric medium can be viewed as a collection of smaller dielectric media, what we refer to here as the

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local microenvironment. Microenvironment describes the three dimensional arrangement of atoms around any given amino acid (or its functional group) within its first contact shell.⁹ It has been shown earlier that certain properties of amino acids, for example pK_a in titratable amino acids, can be altered due to transition between different microenvironments.⁴ It has also been shown that protein microenvironments are crucial in modulating the protonation states of titratable amino acids such as arginine in voltage-gated ion channels,¹⁰ aspartic acid in photo cycle of bacteriorhodopsin,¹¹ glutamic acid in hen egg white lysozyme, and others in several acid-base catalyzed hydrolysis reactions.¹² Despite of all these facts, there is a gap in knowledge of how specifically microenvironment influences the particular role of an amino acid in a protein structure. This is due to insufficient biochemical (experimental) information on individual amino acid microenvironment inside the protein. Microenvironment measurement is experimentally limited only to certain surface exposed amino acid residues which are intrinsic fluorophores or those can be tagged with extrinsic fluorophores.¹³ Recently we have generated a database of microenvironments around all the amino acid side chains in the context of high-resolution protein crystal structures.⁹ In that work, we have demonstrated that each amino acid side-chain is embedded in a wide range of protein microenvironment. The average hydrophobicity of the microenvironment is similar to that of the embedded amino acid side chain. 20–30% of the protein microenvironments significantly differ from that of the corresponding amino acid, those termed as “mismatched microenvironment.” It has also been shown that amino acids in these mismatched microenvironments were evolved to perform specific structure or functional roles in the protein. Moreover that work has also demonstrated that the microenvironments around the conserved residues in respective protein family are also conserved. These observations triggered the question whether different sets of microenvironments are associated with different kinds of functions in an amino acid. Hypothesis based on this question has been tested here on disulfide-bridged cystine residues embedded in the protein microenvironments obtained from an updated microenvironment database. Cystine residues occur by the oxidation of two cysteine amino acids covalently linking them through a disulfide bond. This was chosen as model system because this residue has a limited and simple functional role in proteins, it either plays a structural role or in an enzymatic capacity participates in redox reactions. Out of the six broad enzyme classes (according to the nomenclature committee of International Union of Biochemistry and Molecular Biology, IUBMB)¹⁴ cystines are directly involved in catalytic and redox reactions in the oxidoreductase (thioreductase fold)¹⁵ and hydrolase families.¹⁶

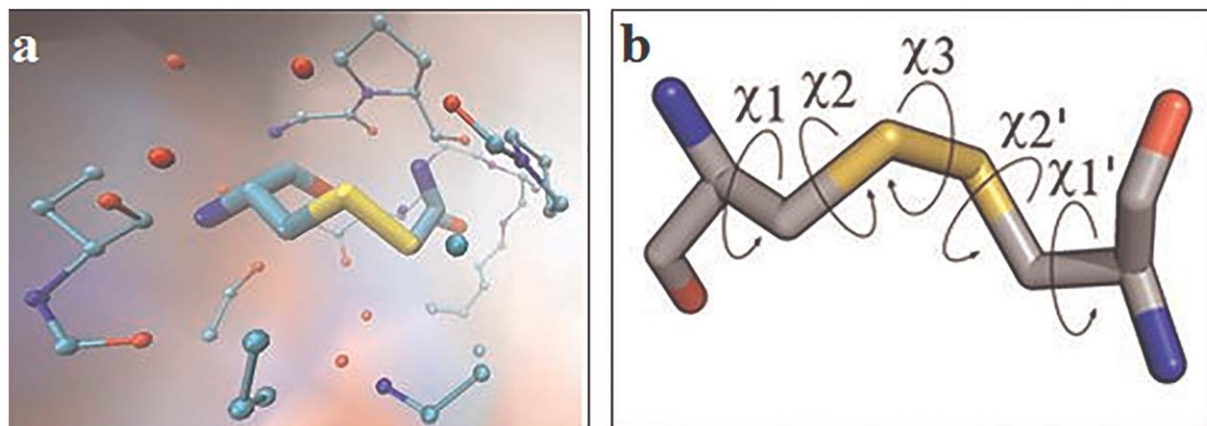
Here, we analyze the previously unexplored cystine functions (here functions imply presence of a cystine in enzyme active site or within its microenvironment) in various protein microenvironments. In this study, protein microenvironments were clustered using hierarchical clustering. Functions in entire microenvironment database (mainly out of the enzymes) were curated from literature and different websites. Grouping of cystine functions based on their microenvironment clusters are discussed in the result section. The notable observation from this study is that the cystines those are part of active sites in specific enzyme classes share similar microenvironments despite of their dissimilarity in overall protein sequences.

METHODOLOGY

Description of microenvironment dataset around disulfide-bridged cystine residues

The current microenvironment dataset around disulfide-bridged cystine residues contains total 5084 cystines from 1303 high resolution protein crystal structures. Part of the dataset was obtained from our previous work, containing 700 disulfide-bridged cystine residues from 175 protein crystal structures.⁹ Remaining 4384 cystines were curated from recent PDB¹⁷ entries, from January 2004 to April 2016. Protein crystal structures with resolution better than 2 Å and sequence similarity <30% were selected. These proteins were not complexed with nucleic acid molecules. Proteins containing modified residues were not included in the dataset. The current selection resulted into 9090 protein structures. Out of this current selection, only 1128 proteins were detected with cystines from PDB header files using SSBOND keyword (see Supporting Information for PDB IDs, Table SI).

The microenvironment around each cystine was described by the amino acid fragments within a given radius, where the radius varies from one atom type to the other [Fig. 1(a)]. The microenvironment space around individual cystine was described using two parameters, “buried fraction” (BF) and hydrophobicity/hydrophilicity (rHpy).⁹ Buried fraction is the fraction of the side-chain of an amino acid which is buried inside the protein and not exposed to outside environment. This parameter was computed using the program GEPOL93 that computes the solvent-excluded surface by filling the solvent-inaccessible spaces with a new set of spheres.¹⁹ Three parameters were used in the computation, the number of triangles per sphere, maximum overlap among the new spheres and the size of the smallest sphere. Default values for these parameters, 3, 0.8, and 0.5, were used. The amino acid side-chain which is completely embedded inside a protein structure will have buried fraction value equal to one and zero when

**Figure 1**

(a) Schematic representation of microenvironment around disulfide-bridged cystine residue. The cystine is shown as tube representation. The microenvironment around the cystine is shown in ball and stick representation. Oxygen atoms of water molecules are shown as isolated red balls. The protein background is shown as surface representation. The schema is created using VMD.¹⁸ (b) Schematic representation of different dihedral angles observed in disulfide-bridged cystine structure. [Color figure can be viewed at wileyonlinelibrary.com]

completely exposed to the solvent. “rHpy” is a quantitative property descriptor (QPD) of microenvironment around a side-chain or fragment of an amino acid.⁹ This QPD estimates the relative hydrophobicity around the amino acid fragment immersed in protein environment with respect to the same in water environment, within a given distance threshold, (that is the radius of the first contact shell around the atom). For example, the microenvironment radius described around a carbon atom is 4.475 Å.¹ From the definition of rHpy, an amino acid side-chain have maximum rHpy value of one when it is completely exposed to water. By definition, there is no absolute minimum rHpy value. Minimum rHpy value varies among proteins and that is decided by the hydrophobicity of individual protein interior. The lowest rHpy value observed in this microenvironment dataset is −0.4.

Curation of cystine functionalities in protein structures from literature

Functions of 5084 disulfide-bridged cystines were extracted from published literature, PDB header files,¹⁷ Catalytic Site Atlas (CSA)²⁰ and PDBSUM³⁸ database. Each sulfur atom from a cystine is defined as a half-cystine through-out this article. The half-cystines were defined functional when those are marked as “catalytic sites” or as “active site” in PDBSUM website.³⁸ Catalytic sites were defined by the Catalytic Site Atlas (CSA).²⁰ Active sites were defined by PDBSUM³⁸ from the SITE records of the PDB header files.¹⁷ The analysis of functional half-cystines has been performed over all the available enzyme classes in the current data set. A total of 617 enzymes containing cystines were analyzed (Supporting Information Table SII).

Clustering of microenvironment space

Clustering methods are mainly of two types: partitioning and hierarchical.²¹ In this study, agglomerative clustering, a subclass of hierarchical clustering has been employed.²² Agglomerative clustering is a type of hierarchical clustering where each observation is initially considered as a single cluster; based on the distance proximity of the nearest cluster centers, the smaller clusters combine to form large dissimilar clusters. Initially, the microenvironment space was divided into small bins with equal spacing [(BF, rHpy) = (0.1, 0.1)]. Agglomerative clustering method incorporates small microenvironment bins into larger dissimilar clusters where the Euclidean distance of each bin from cluster center is minimal with respect to other cluster centers. Ward’s method²³ of agglomerative clustering was employed.²⁴

Identification of cystine residues in different structural classification of protein (SCOP) classes

Protein classes for all the 617 enzymes were attempted to extract from Structural Classification of Proteins (SCOP) database.²⁵ As latest SCOP database entry dated back to 2009 and our current selection dated, April 2016, SCOP classification was not available from the same database, for some PDB entries. In those cases, structural classification was done based on PDBFold.²⁶ The secondary structures were calculated for individual proteins using Kabsch and Sander algorithm²⁷ in the Dictionary of Protein Secondary Structure (DSSP) calculation.²⁸

Analysis of cystine geometry in hydrophobic and hydrophilic microenvironments

Disulfide-bridged cystine structures are governed by their internal conformations, the five dihedral angles,

Table 1Description of Different Microenvironment Clusters Around Half-Cystines, (S-S)_{1/2}

Cluster	Center ^a	D ^b (Å)	V ^c	Cluster-size	N ^d
Buried hydrophobic	0.947, 0.164	0.212	0.063	8549	1071 (12.5)
Buried hydrophilic	0.770, 0.482	0.186	0.043	1465	960 (66)
Exposed hydrophilic	0.328, 0.720	0.145	0.031	154	142 (92)

Clusters are defined in terms of buried fraction and rHpy using agglomerative hierarchical clustering.²¹ Number of other half-cystine (partner in the disulfide) is also reported along with the normalized values in parenthesis. Clusters are arranged, according to descending order of hydrophobicity, measured by cluster center values.

^aCentroid values of buried fraction, rHpy.

^bAverage distance to center.

^cWithin-class variance.

^dNo. of cystines present in different clusters (Normalized value in %).

namely chi1, chi2, chi3, chi1' and chi2' [Fig. 1(b)]. Based on these dihedral angles, dihedral strain energies²⁹ were computed for all the 5084 cystines in the current dataset. The program used to compute the disulfide dihedral strain energy (DSE) and is publicly available as a server (<http://services.mbi.ucla.edu/disulfide/>).

Sequence and structural alignment of proteins in the dataset

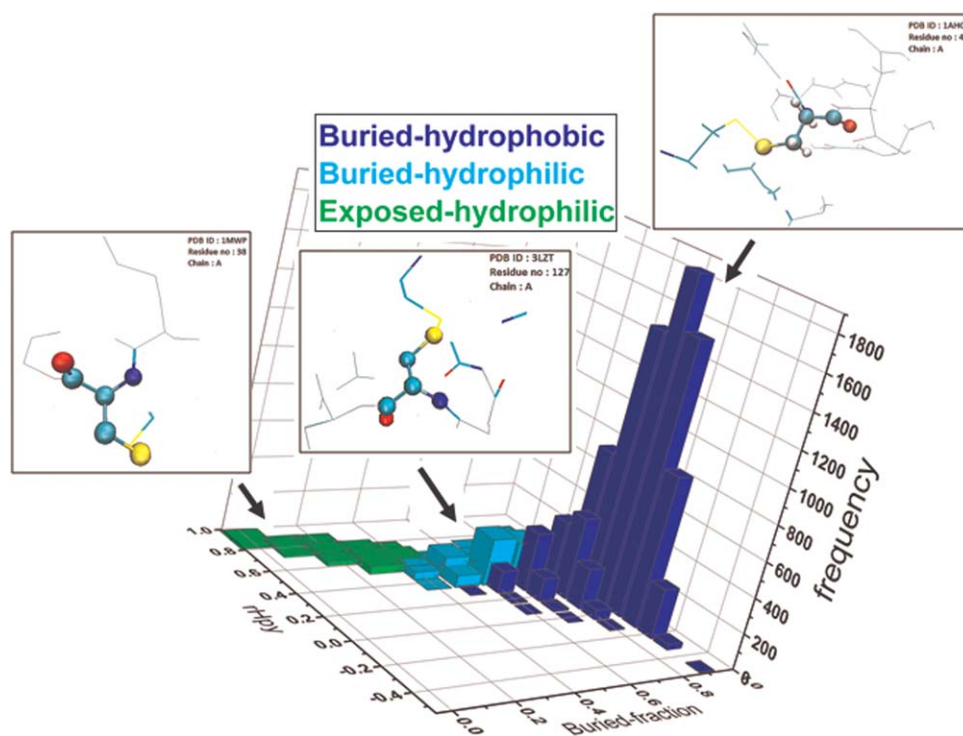
Sequence and structural alignment were performed for two enzyme classes; oxidoreductases and hydrolases. Global

sequence alignment was performed using T-COFFEE³⁰ and local alignment was performed using COBALT.³¹ The structural alignment was performed using SALIGN.³²

RESULTS AND DISCUSSIONS

Validation of the updated microenvironment dataset around disulphide (TD⁹) group of cystine

Microenvironment dataset around disulphide group of cystine amino acid, generated based on the current PDB

**Figure 2**

Distribution of different microenvironment clusters (obtained from hierarchical clustering) around all the half-cystines from 1478 different proteins in our updated microenvironment dataset. Microenvironments are being clustered in the space of buried fraction and rHpy values. Frequencies in each cluster are shown along z-axis. The plot was generated using Origin [Origin (OriginLab, Northampton, MA)]. Insets show ball and stick representations of representative microenvironments around half-cystines from the 3 different clusters. Thicker sticks highlight bonds within the microenvironment around the sulfur atoms and thin sticks represent the extended microenvironment around the cystine residue.

Table II

Distribution of Secondary Structures in Different Microenvironment Clusters, Results Obtained from DSSP Analysis

	Buried hydrophobic	Buried hydrophilic	Exposed hydrophilic	Total
Helix (G+H+I)	1976 (0.23)	322 (0.22)	33 (0.21)	2331
Beta strand (B+E)	2968 (0.35)	268 (0.18)	32 (0.21)	3268
Turn (T)	630 (0.07)	183 (0.12)	18 (0.12)	831
Coil (C)	2251 (0.26)	536 (0.37)	58 (0.38)	2845
Bend (S)	724 (0.08)	156 (0.11)	13 (0.08)	893

The values given in parenthesis are normalized with respect to the total number of (S-S)_{1/2} in a particular cluster.

entries, was validated with respect to our previously observed dataset.⁹ Buried fraction and rHpy, the two parameters used throughout this work to describe microenvironment, were compared across the previous and the current datasets. Mean and standard deviation values (given within the parenthesis) for buried fraction and rHpy, in the current dataset are 0.91 (0.13) and 0.22 (0.18), respectively. These are in close agreement to the values from the previous dataset (0.92 (0.12) and 0.21 (0.16) respectively; Table III in reference 1 for TD group). Agreement of the microenvironment descriptors in current and previous datasets indicates that despite of the dataset size, overall nature of the protein microenvironments around cystines remain the same. In addition to the mean values of these property descriptors, percentage of cystines microenvironment outliers, (outliers are defined as those outside of one standard deviation with respect to the mean value) are also compared across previous and current datasets. Total number of outliers in the current dataset is 906; 8.9% of the total dataset; this value is fairly in agreement with that in the previous dataset (9.3%; Table I in reference 1).

Microenvironment clusters around cystine residues distributed in high-resolution crystal structures with 25–30% sequence similarity

Microenvironment clusters around half-cystines -(S-S)_{1/2}- were obtained using agglomerative clustering, resulting into three categories (i) buried-hydrophobic,

(ii) buried-hydrophilic, and (iii) exposed-hydrophilic (Table I). These microenvironment clusters gradually progress from protein interior to surface (decrease in BF) with increasing hydrophilic character (increase in rHpy) (Fig. 2).

Cystine residues in buried-hydrophobic cluster are observed inside the protein interior, (average buried fraction, 0.95) (Supporting Information Fig. S1). The buried-hydrophobic cluster mainly contains half-cystines which are buried deep inside the protein core and embedded in hydrophobic microenvironment (average rHpy 0.16) (Fig. 2 and Supporting Information Fig. S1). Conversely, half-cystines in the buried-hydrophilic cluster are buried inside the protein (average buried fraction, 0.77) which constitutes relatively hydrophilic protein microenvironment (average rHpy, 0.48). Half-cystines in the exposed-hydrophilic cluster are observed on the outer surface of proteins (average buried fraction of 0.33) and have relatively high hydrophilic microenvironment (average rHpy 0.72). Interestingly, cluster sizes (number of half-cystines in each cluster) gradually decreases with hydrophilicity in the clusters (Table I), indicating that cystine residues tend to be in buried hydrophobic microenvironments.⁹

Both half-cystines derived from the same disulfide bonded cystine not necessarily fall into the same microenvironment cluster. The second sulfur atom from the disulfide bond tend to stay in the same microenvironment cluster, provided the later is hydrophobic (Table I).

Correlation between secondary, super-secondary structures and microenvironment clusters around half-cystines

The correlation between secondary structures of half-cystines and respective protein folds was known.³³ Here we aim to find out whether half-cystines with similar secondary structures (e.g., alpha helix, beta sheet, or coil) populate into similar microenvironment clusters. Microenvironment can be viewed as the local tertiary structure around a particular amino acid which might include different components of secondary structures. Therefore, there is a possibility of underlying relationship between

Table IIIDescription of Different Microenvironment Clusters Populated with -(S-S)_{1/2} - from Different Enzyme Classes

Cluster	E	Oxidoreductases ^a	Hydrolase	Lyase	Transferase	Isomerase
Buried hydrophobic	3571 ^b	571 (0.16)	2471 (0.69)	97 (0.03)	355 (0.1)	59 (0.02)
Buried hydrophilic	717 ^c	104 (0.15)	520 (0.73)	29 (0.04)	54 (0.08)	4 (0.01)
Exposed hydrophilic	31	0 (0.0)	28 (0.90)	0 (0.0)	2 (0.06)	1 (0.03)

The total numbers of -(S-S)_{1/2} -, present in an enzyme class in each cluster (E), are reported. The number of -(S-S)_{1/2} - in individual enzyme classes are also reported, along with their normalized values, given in parenthesis. The values are normalized with respect to the total number of half-cystines present in a particular microenvironment cluster as part of an enzymes class (E).

^aAnd Electron transport proteins.

^b18 cystines were observed as part of ligase.

^c6 cystines were observed as a part of ligase.

Table IV

Number of $-(S-S)_{1/2}$ - with Different Main Chain Conformations Present in Enzyme Classes—Hydrolases, Oxidoreductases and Transferases

Enzyme class	Total number of cysteines	Alpha helix	Beta sheet	Loop
Hydrolases	3019	656	869	1495
Oxidoreductases and 675 Electron transport proteins	209		91	375
Transferases	411	77	124	210

super-secondary structures (protein classes) and amino acid microenvironment, particularly, around disulphide-bridged cystines which dictates protein scaffolds. It has been shown earlier that similar disulphide bonding patterns lead to similar fold, families and super-families of proteins, despite of their low sequence identity.³⁴ To understand the main-chain conformations of half-cystines in different microenvironments, DSSP secondary structure analyses were performed on our protein dataset. Preferences of different secondary structures around half-cystines in three different microenvironment clusters were observed and are described below (Table II).

The buried-hydrophobic cluster possesses higher percentage of beta secondary structures (and to lesser extent

alpha helical structures). The buried-hydrophilic cluster predominates in coil conformations. The exposed-hydrophilic cluster mainly possesses cystines in coil conformations. These results have suggested that the half-cystines buried in hydrophobic microenvironment are mainly comprised of alpha and beta secondary structures, whereas, partly exposed half-cystines embedded in hydrophilic microenvironment, predominate in flexible conformations, like coils. Here we have attempted to identify microenvironment specific functions of cystines observed with different secondary structures. As the functions of cystines are mainly associated with enzymes, in the following section we have analyzed cystine functions for 617 enzymes from all the enzyme classes¹⁴ present in our current dataset.

Buried-hydrophobic microenvironment cluster hosts half-cystines from redox-active $-C-x-x-C-$ motif

The half-cystines present in buried-hydrophobic microenvironment cluster, mainly come from (i) oxidoreductase and electron transport proteins, (ii) hydrolase, (iii) lyase, (iv) transferase, and (v) isomerase enzyme classes (Table III). Hydrolase is the most frequently

Table V

Buried Hydrophobic Microenvironment Cluster: Secondary Structures and Strain Energies of Redox-Active Cystines (Part of C-x-x-C motif), Present in Different Oxidoreductases Enzymes and Electron Transport Proteins

PDB	Fold SCOP or PDBeFOLD ^a	Cystine Numbers (Chain)	Half-cystine in helix (Chain) [cluster no.]	Half-cystine in beta turn ^b (Chain) [cluster no.]	Strain Energy (KJ/mol)	BF	rHpy
3ZIT	Thioredoxin ^a	12 (A)–15(A)	15 (A) [2]	12 (A) [1]	11.4	0.732	0.375
3GWN	a ^c	80(A)–83(A)	83 (A) [2]	80 (A) [2] ^d	19.5	0.751	0.275
3GWN	a ^c	80(B)–83(B)	83 (B) [2]	80 (B) [2] ^d	21.5	0.800	0.228
4HS1	Thioredoxin	11(A)–14(A)	14 (A) [2]	11 (A) [2]	13.0	0.804	0.194
3POK	b ^e	155 (A)–158(A)	158 (A) [2]	155 (A) [2]	8.23	0.805	0.162
3ZIT	Thioredoxin ^a	12 (B)–15(B)	15 (B) [2]	12 (B) [1]	11.6	0.871	0.33
3FZ4	Thioredoxin ^a	10 (A)–13(A)	13(A) [2]	10 (A) [2]	10.5	0.926	0.095
1THX	Thioredoxin	32(A)–35(A)	35(A) [2]	32 (A) [1]	15.4	0.953	0.106
1JR8	a ^c	54(A)–57(A)	57 (A) [1]	54 (A) [2] ^d	19.1	0.960	0.045
1H75	Thioredoxin	11(A)–14(A)	14 (A) [2]	11 (A) [2]	13.5	0.967	0.192
2I4A	Thioredoxin ^a	32(A)–35(A)	35 (A) [2]	32 (A) [2]	11.4	0.978	0.029
2B1L	Thioredoxin	80(B)–83(B)	83 (B) [2]	80 (B) [1]	25.8	0.984	0.149
2B1L	Thioredoxin	80(A)–83(A)	83 (A) [2]	80 (A) [1]	25.0	0.986	0.142
1FVK	Thioredoxin	30(B)–33(B),	33(B) [2]	30 (A) [1]	14.3	0.988	0.065
1FVK	Thioredoxin	30(A)–33(A),	33(A) [2]	30 (A) [1]	19.2	0.993	–0.021
1KNG	Thioredoxin	92(A)–95(A)	95 (A) [2]	92 (A) [2]	19.3	0.996	–0.017
1ABA	Thioredoxin	14(A)–17(A)	17 (A) [2]	14 (A) [1]	12.4	0.997	0.130
2HLS	Thioredoxin ^a	150(B)–153(B)	153 (B) [2]	150 (B) [1]	10.3	0.998	0.078
1ST9	Thioredoxin	73(A)–76(A)	76 (A) [2]	73 (A) [2]	14.8	0.999	0.077
1ST9	Thioredoxin	73(B)–76(B)	76 (B) [2]	73 (A) [2]	13.0	0.999	0.119
2HLS	Thioredoxin ^a	150(A)–153(A)	153 (A) [2]	150 (A) [1]	12.2	1.000	0.117
3IQS	Thioredoxin ^a	81 (A)–84(A)	84 (A) [2]	81 (A) [2]	- ^f	1,000	0.015

Residue numbers of half-cystines corresponding to each cystine are shown (column 3). Respective cluster numbers are given in parenthesis. Buried hydrophobic cluster is referred to as 2 and buried hydrophilic cluster is referred to as 1 here. Folds of individual residues are mentioned either from SCOP²⁵ and PDBeFOLD.²⁶

^aObtained from PDBeFold.²⁶

^bUnless otherwise mentioned; according to DSSP program.^{27,28}

^cRepresents Four-bundle-up-and-down bundle fold.

^dHalf-cystine present in Gamma turn instead of beta turn.

^eRepresents spectrin repeat like fold.

^fStrain energy cannot be calculated by the "Disulfide Bond Dihedral Angle Energy Server."³⁵

Table VI

Half-Cystines (First Out of the Pair of Half-cystines from a Disulphide Shown in the Table) Present in Different Enzyme Active Site or its Embedded Microenvironment, Reported from Buried-Hydrophilic Cluster Protruding Toward Protein Surface (Buried-Fraction < 0.78 and rHpy > 0.40)

PDB ID	cystine (chain)	2° structures	Sequence conservations ^a	Strain energy (KJ/mol)	Active residues in 4.5 Å region in half-cystine	BF	rHpy
Cystines in active site in hydrolases							
3EDH	65(A)–64(A)	Coil-bend	High-high	13	C64	0.438	0.602
1K7C	232(A)–214(A)	COIL-helix ^b	Low-high	6.3	C232	0.471	0.575
2FHF	643(A)–644(A)	bend-bend	High-medium	9.8	C643,T642,H607	0.512	0.547
3B8Z	376(A)–371(A)	Turn-beta ^c	Medium-low	13.4	C376,L370	0.528	0.567
4XOJ	124(A)–225(A)	Coil-helix	Medium-medium	10.9	C124,A125	0.531	0.538
1QNR	284(A)–334(A)	Helix-helix	Medium-low	5.5	C284	0.534	0.512
3B8Z	376(B)–371(B)	Turn-beta	Medium-low	13.2	C376,L370	0.545	0.553
3EQA	473(A)–246(A)	Coil-helix	High-low	15.4	C473	0.572	0.534
3HHI	215(B)–154(B)	Coil-helix	High-high	6.3	C154	0.586	0.521
3KUV	73(A)–73(B)	Beta-beta	Low-low	14.5	C73,v74	0.596	0.547
3EDH	64(A)–65(A)	Bend-coil	High-high	13	C64	0.598	0.415
3TBJ	45(A)–28(A)	Turn-coil	High-high	8.9	C45	0.602	0.546
4HWX	31(A)–46(A)	Beta-helix	High-high	7.6	C31,A32	0.605	0.474
1LNI	96(B)–7(B)	Coil-beta	High-low	10.7	C96	0.622	0.505
2WBF	636(X)–593(X)	Turn-helix	High-high	5.3	C636,R635	0.638	0.477
1LNI	7(A)–96(A)	Beta-coil	Low-high	12	C7	0.639	0.515
3ARX	121(A)–116(A)	Beta-coil	High-high	15.5	C121	0.645	0.424
1G6X	14(A)–38(A)	Coil-bend	High-high	12.7	C14	0.649	0.42
3WQB	301(A)–326(A)	Turn-coil	High-high	8.7	C326	0.678	0.526
3TBJ	44(A)–149(A)	Turn-helix	High-high	4	C45	0.71	0.44
4D04	127(B)–158(B)	Turn-turn	High-high	14.8	C127,D80	0.718	0.476
4CPY	336(B)–317(B)	Turn-coil	High-high	12.3	C336	0.721	0.406
4D04	127(A)–158(A)	Turn-turn	High-high	14.5	C127,D79	0.724	0.47
3A21	604(B)–585(B)	Coil-beta	Medium-low	14.7	C604,E577	0.74	0.468
3ZFP	69(A)–168(A)	Turn-coil	High-high	15.1	C69	0.74	0.509
3A21	604(A)–585(A)	Coil-beta	Medium-low	14.9	C604,E577	0.749	0.46
4Y5L	255(A)–290(A)	Turn-beta	High-high	14	C255	0.759	0.406
Cystines in the active site of Oxidoreductases							
1ZK7	465(A)–464(A)	Bend-bend	Medium-medium	23.4	C465,A466,C464	0.484	0.534
1ZK7	464(A)–465(A)	Turn-coil	Medium-medium	23.4	C464,	0.503	0.566
4OZ7	4(B)–10(B)	Coil-coil	NA ^d -NA ^d	16.4	C4,C10,S5	0.528	0.568
4OZ7	10(B)–4(B)	Coil-coil	NA ^d -NA ^d	16.4	C10,C4,S5,P8	0.583	0.543
5DQY	62(A)–69(A)	Bend-coil	NA ^d -NA ^d	9.3	C62,Q63,S67	0.586	0.49
4OZ7	10(A)–4(A)	Coil-coil	NA ^d -NA ^d	17.3	C10	0.595	0.534
4OZ7	4(A)–10(A)	Coil-coil	NA ^d -NA ^d	17.3	C4	0.597	0.476
4NTC	148(A)–145(A)	Turn-coil	NA ^d -NA ^d	14.8	C148,H144	0.643	0.435
2Q0L	136(A)–133(A)	Helix-coil	High-medium	- ^e	C136,Q289	0.649	0.51
2Q0L	133(A)–136(A)	Coil-helix	Medium-high	- ^e	C133,T132,C136, K288,Q289	0.658	0.537
Cystines in the active site of transferases							
4WMA	385(A)–356(A)	Turn-coil	NA ^d -NA ^d	20.4	C385,W358	0.587	0.473
2APC	115(A)–145(A)	Bend-turn	Medium-medium	8.6	C115,A114	0.622	0.419
Cystines in the microenvironment of active site residues of hydrolases							
2VB1	6(A)–127(A)	Helix-turn	High-high	5.1	E7,I124	0.367	0.719
3RLG	53(A)–201(A)	Turn-turn	High-high	14.4	N200	0.447	0.652
3LUM	269(C)–297(C)	Coil-helix	High-high	14.1	P249	0.557	0.476
3KUV	73(B)–73(A)	Beta-beta	Low-low	14.5	C73,V74	0.567	0.539
3C1U	96(A)–88(A)	Beta-helix	Medium-high	9.8	Y97	0.588	0.444
3NKU	801(A)–413(A)	Turn-bend	High-high	3.6	S800	0.617	0.462
1KNM	119(A)–100(A)	COIL-Beta	High-high	13.2	Y117	0.62	0.489
1EB6	117(A)–177(A)	Turn-Coil	Medium-high	30	H118	0.624	0.409
1G66	2(A)–79(A)	Coil-Bend	High-high	6	S1,S74	0.631	0.554
2NLR	69(A)–64(A)	Beta- Beta	Medium-medium	19.8	H69	0.635	0.467
2D1Z	425(A)–406(A)	Coil-beta	Medium-medium	13.2	Y423	0.645	0.437
3TRS	101(D)–18(D)	Coil-bend	High-high	13.9	G15	0.646	0.458
2WJ9	13(B)–125(A)	Bend-coil	Low-medium	7.3	C129	0.647	0.524
3EQN	77(A)–73(A)	Coil-bend	Medium-high	13.4	D78	0.65	0.491
2XXL	197(A)–188(A)	Beta-beta	High-low	18.2	D187	0.671	0.476
3LUM	250(A)–277(A)	Turn-turn	High-high	2.9	P249	0.673	0.439
3LUM	250(C)–277(C)	Turn-turn	High-high	3	P249	0.675	0.437
3LUM	250(B)–277(B)	Turn-turn	High-high	3.2	P249	0.676	0.437

Table VI
(Continued)

PDB ID	cystine (chain)	2° structures	Sequence conservations ^a	Strain energy (KJ/mol)	Active residues in 4.5 Å region in half-cystine	BF	rHpy
2WJ9	13(A)–125(B)	Coil-coil	Low-medium	7.4	C129	0.677	0.456
3LUM	250(D)–277(D)	Turn-turn	High-high	3.7	P249	0.679	0.434
3LZT	6(A)–127(A)	Helix-coil	High-high	5.78	R128	0.68	0.441
4M1U	56(F)–3(F)	Coil-beta	Medium-medium	7.6	S54	0.68	0.526
2XXL	197(B)–188(B)	Beta-bend	High-low	18.2	D187	0.69	0.499
1LBU	81(A)–3(A)	Bend-bend	Medium-medium	11.1	D80	0.691	0.43
3A21	647(B)–628(B)	Coil-beta	Low-medium	17.1	G626,W645	0.693	0.432
4HYQ	53(A)–28(A)	Coil-helix	High-high	10.8	S54	0.693	0.467
1I71	1(A)–78(A)	Beta-Coil	High-high	7.5	P79	0.699	0.44
4H04	589(B)–564(B)	Coil-beta	High-high	11.4	N588	0.703	0.557
4H04	589(A)–564(A)	Coil-beta	High-high	11.5	N588	0.705	0.489
3TRS	101(B)–18(B)	Coil-coil	High-high	15.6	G15	0.71	0.455
4EMN	291(C)–355(C)	Helix-helix	High-high	8.1	E292,C355	0.711	0.41
2IFR	148(A)–141(A)	Beta-beta	Low-medium	13.9	E139	0.72	0.402
1Y43	101(B)–18(B)	Coil-coil	High-high	11.8	E19	0.735	0.436
2D1Z	842(B)–823(B)	Coil-beta	High-High	12.3	H843,Y840	0.737	0.436
2FHF	644(A)–643(A)	Bend-beta	Medium-high	9.8	T642,H607	0.74	0.401
3B8Z	371(B)–376(B)	Beta-beta	Low-medium	13.2	L370,C376	0.749	0.487
3A21	562(A)–543(A)	Coil-beta	Medium-low	13.3	N563,W560	0.752	0.464
2I9A	50(D)–131(D)	Bend-bend	High-high	8.1	H129	0.753	0.436
2XU3	65(A)–22(A)	Turn-helix	High-high	7.7	G23	0.757	0.403
4HYQ	28(A)–53(A)	Helix-coil	High-high	10.8	S54	0.766	0.421
3B8Z	371(A)–376(A)	Beta-turn	Low-medium	13.4	L370,C376	0.785	0.4
Cystine in microenvironment of active site residues in Transferases							
4WTP	264(A)–218(A)	Coil-helix	Medium-high	12.7	K221,A262	0.642	0.402
4EBY	93(A)–25(A)	Beta-coil	High-high	8.3	F98	0.64	0.461
Cystine in microenvironment of active site residues in Lyases							
4Q8K	365(A)–377(A)	Coil-helix	High-high	9.1	K364	0.636	0.47
3KBR	131(A)–210(A)	Helix-beta	High-medium	7.7	H213,P214,N215	0.642	0.542
Cystine in microenvironment of active site residues in Electron transport proteins							
2Z8Q	48(A)–21(A)	Helix-high	Low-coil	11.3	L20	0.601	0.543
Cystine in microenvironment of active site residues in Isomerases							
3O22	89(A)–186(A)	Beta-bend	High-high	6.1	F83	0.257	0.75

Secondary structures and sequence conservation of each half-cystines were reported along with the strain energy of the cystine disulphide bonds. PDB IDs are arranged according to the increasing values of buried fraction (second last column). Amino acids and their positions involved in enzyme active sites are mentioned in third last column.

^aSequence conservation obtained from PdbSum.³⁸

^bIncludes 3(10)-helix, alpha-helix and π -helix secondary structures calculated by DSSP.^{27,28}

^cIncludes beta sheet, beta bridge and beta strand secondary structures calculated by DSSP program.^{27,28}

^dSequence conservation was not reported by "The ConSurf Server."³⁶

^eStrain energy cannot be calculated by the "Disulfide Bond Dihedral Angle Energy Server."³⁵

observed enzyme class in this cluster, as this enzyme class constitutes the maximum population size. Conversely, oxidoreductase and electron transport proteins were exclusively present in buried clusters, either hydrophobic or hydrophilic (0 half-cystines were observed in exposed-hydrophilic cluster from oxidoreductase and electron-transport proteins). In the following part of this section, we have attempted to answer the question why oxidoreductase and electron transport proteins are selective toward buried clusters only. Out of the 675 half-cystines in oxidoreductase and electron-transport proteins, 209 belong to alpha helical secondary structure (Table IV). Twenty two cystines in alpha helical conformations were part of redox-active C-x-x-C- motif (Table V). 18 out of 22 cystines, belongs to thioredoxin fold. All these 22 cystines have higher strain energies compared to remaining

disulphides in buried-hydrophobic cluster (average value of strain energy in buried-hydrophobic cluster is 11.13 KJ/mol). The above redox active half-cystines with alpha helical conformations in thioredoxin fold span a small region within buried-hydrophobic cluster, with few exceptions (Table VI). One prominent exception is, Cys15 (chain A) of a thioredoxin like mutant protein (PDB ID:3ZIT) that significantly differ from other thioredoxin proteins due to the presence of a Thr53 residue (not conserved) within the microenvironment of -C-x-x-C- motif.³⁷ The second Cys from -C-x-x-C- motif belongs to beta turn secondary structure for all the above thioredoxin folds (as obtained from PDBSUM³⁸) (Table V). The active half-cystines, part of four-helical bundle folds, possess the second Cys in gamma turn secondary structure. It has been proposed earlier that redox active

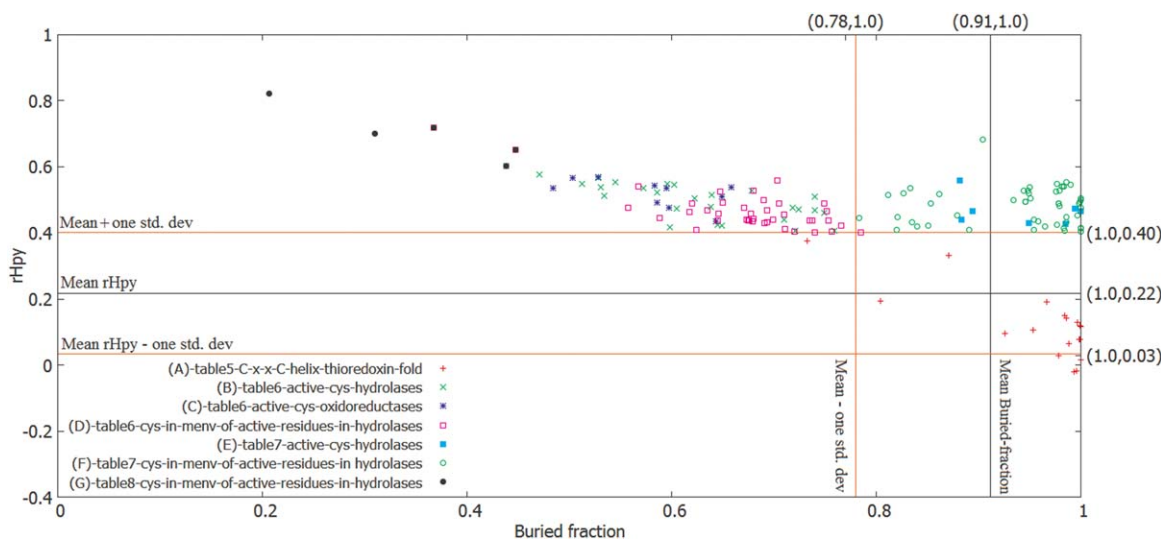


Figure 3

Microenvironments of half-cystines depicted in buried fraction and rHpy space—(a) (red diamond) as a part of -C-x-x-C- motif in thioredoxin fold with alpha helical geometry (values given in Table V); (b) (green cross) as a part of the active sites in hydrolase enzyme class present in buried hydrophilic cluster protruding toward protein surface (values given in Table VI); (c) (blue star) as a part of the active sites in oxidoreductase enzyme class present in buried hydrophilic cluster protruding toward protein surface (values given in Table VI); (d) (magenta square) as a part of the microenvironment around the active sites in hydrolase enzyme class present in buried hydrophilic cluster protruding toward protein surface (values given in Table VI); (e) (cyan filled square) as a part of the active sites in hydrolase enzyme class present in buried hydrophilic cluster protruding toward protein interior (values given in Table VII); (f) (green circle) as a part of microenvironment surrounding the active sites in hydrolase enzyme class present in buried hydrophilic cluster protruding toward protein interior (values given in Table VII); (g) (black filled circle) as a part of the active sites in hydrolase enzyme class present in exposed hydrophilic cluster (values given in Table VIII). Mean values of buried fraction and rHpy are shown by black lines. One standard deviation values with respect to buried fraction and rHpy are shown in orange. [Color figure can be viewed at wileyonlinelibrary.com]

cystines in oxidoreductases prefer alpha helical conformation due to their easy cleavage.³⁹ To analyze the residues involved in -C-x-x-C- motif of thioredoxin fold, sequence and structural alignment of these proteins (listed in Table V) were performed. Global sequence alignment (using T-COFFEE³⁰) revealed 37% of sequence identity among all these 13 sequences. The local sequence alignment shows the conservation of -C-x-x-C- motif in all these proteins, with an exception of one protein, PDB ID: 1FVK (Supporting Information Fig. S2). However, structural alignment of the above full proteins resulted into C-alpha RMSD value of 4.4 Å in the structurally aligned regions (as obtained from SALIGN³²). It was reported earlier that the redox active cystines, part of -C-x-x-C- motif in thioredoxin folds, were mainly observed in beta-alpha-beta fold region.¹⁵ Superimposition of beta-alpha-beta regions from above 13 proteins shows Cα RMSD of 1.99 Å (Fig. 3). The Cα RMSD of the superimposed cystine residues in those proteins is 1.4 Å. The Cα RMSD of the microenvironment around the cystines in -C-x-x-C- motif of thioredoxin fold is 1.7 Å. The novel finding in this work is that these half-cystines at the active site share near-identical microenvironment as a consequence of having a common fold (Fig. 4).

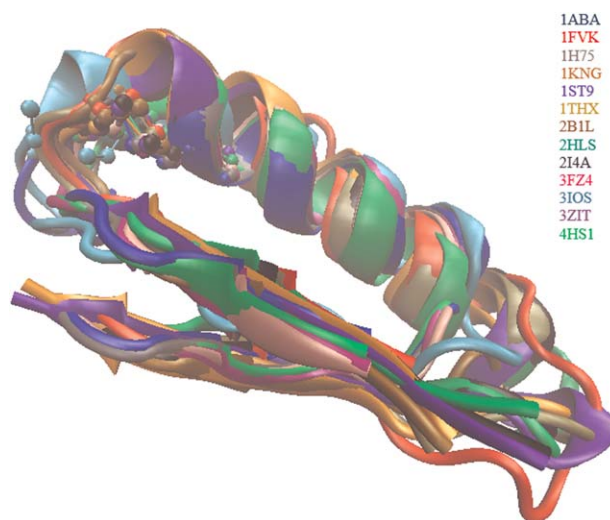


Figure 4

Superimposed beta-alpha-beta region from 13 proteins with thioredoxin fold. Half-cystine from different proteins in this aligned regions are depicted by different colors. Disulphide bridges are shown by spheres connected by sticks. Beta-alpha-beta regions are represented through cartoons. [Color figure can be viewed at wileyonlinelibrary.com]

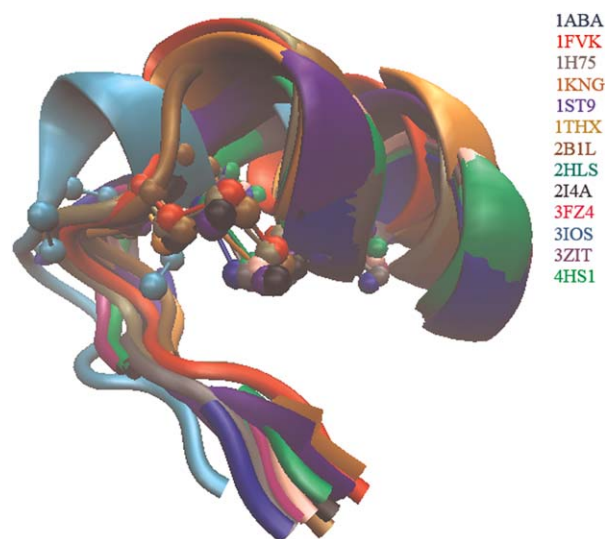


Figure 5

Conservation of microenvironment around disulphide bridge (-S-S-) in -C-x-x-C- motif from 13 proteins in alpha-helical conformations of thioredoxin folds. Microenvironment in each case have alpha-helical conformation on one side and beta turn on the other side. -C-x-x-C motif in all these proteins are encompassed within the cleft created by alpha helix and beta turn region. Disulphide bond is represented as spheres connected by sticks. The cartoon diagram represents alpha helix and beta turn. [Color figure can be viewed at wileyonlinelibrary.com]

Buried-hydrophilic cluster hosts half-cystines from enzyme active sites or from surrounding microenvironments of the catalytic (or active) sites

Buried-hydrophilic microenvironment cluster contradicts with the intrinsic hydrophobic character of disulphide-bridged cystine residues. The average buried fraction and rHpy values of cystines in the total dataset (total 10,168 half-cystines) are 0.91 and 0.22 respectively. Respective one standard deviation values for buried fraction and rHpy are 0.13 and 0.18 (Fig. 5). Cystines outside one standard deviation values of buried fraction and rHpy were defined to have mismatched microenvironment.⁹ Cystines from buried hydrophilic cluster, encountering mismatched microenvironment (total 963 half-cystines), are mostly exposed toward the surface of the protein (buried fraction <0.78 and rHpy >0.40). Out of these, 445 belongs to enzymes; mostly from hydrolase enzyme class (332 half-cystines, constituting 74% of the enzyme class in buried hydrophilic cluster). Total 39 half-cystines were detected as part of the enzyme active sites and 47 in the microenvironments around enzyme active sites (Table VI). Two-third of the active half-cystines in hydrolases have high sequence conservation according to ConSurf Server.⁴⁰ There were only three active half-cystines in hydrolases with low sequence conservation. No active half-cystines in oxidoreductases

exhibited low sequence conservation (Table VI). In terms of the secondary structures of active half-cystines, those from oxidoreductases mainly adopted coil or turn conformations and exposed toward the protein surface (Fig. 5). Hydrolases, being the largest class of enzyme in buried-hydrophilic cluster, secondary structures of half-cystine pairs (from a disulphide) have wider variations in comparison to those in oxidoreductases. However, active half-cystines from hydrolases cluster together into smaller sub-groups (Fig. 5). The one toward the protein interior is more densely packed. All the half-cystines from this sub-group share similar secondary structure with their counter-parts in the disulphide (Table VI). Remaining half-cystines from hydrolases are more scattered (toward exposed region) in buried-fraction—rHpy space (Fig. 5), that can presumably be attributed to two different secondary structures of half-cystines in a disulphide (Table VI).

Apart from the half-cystines protruding toward protein surface (BF <0.78 and rHpy >0.4) in buried hydrophilic cluster, we have also explored the functionalities of half-cystines embedded in hydrophilic microenvironment protruding toward protein interior (buried fraction >0.78 and rHpy >0.40). These cystines also exhibited catalytic activities but to lesser extent compared to the cystines those discussed in the above paragraph. Total 652 such half-cystines were obtained. Out these 337 belong to enzyme classes. Only seven half-cystine were part of active site and 63 were reported as part of the microenvironment around the active sites (Table VII). One compact sub-group of half-cystines from microenvironment of the active site was observed (buried fraction ~1) (Fig. 5). Within this sub-group, almost all the half-cystines share the same secondary structures with its counterpart in the disulphide (Table VII). This observation is similar to our observation in the previous paragraph for densely packed sub-group (Table VI and Fig. 5). This analysis has shown that the cystines in the microenvironment of catalytic residues, on average, have high strain energies compared to the average strain energy in this microenvironment cluster (11.0 KJ/mol). Despite of low or medium sequence conservation in some of the half-cystines, all these half-cystines share very similar microenvironment (Fig. 5). One of the reasons for low sequence identity of these cystine residues is their occurrences in irregular secondary structures (coil, turn etc.) in contrast to cystines in -C-x-x-C- motif of thioredoxin fold (fully conserved). It has been shown in Table V that the cystines in -C-x-x-C- motifs from oxidoreductase or electron transport proteins mainly occupy alpha-helical structure to facilitate easy cleavage of the disulfide bond, with high strain energy values. These observations together suggest that cystines within the microenvironment of catalytic residues of hydrolase enzyme do not require easy cleavage of the disulfide bond as in thioredoxin folds.

Table VII

Half-Cystines (First Out of the Pair of Half-Cystines From a Disulphide Shown in the Table) Present in Different Enzyme Active Site or its Embedded Microenvironment, Reported from Buried-Hydrophilic Cluster Protruding Toward Protein Interior (Buried-Fraction > 0.78 and rHpy > 0.40)

PDB ID	Cystine (chain)	2° structures	Sequence conservations ^a	Strain energy (KJ/mol)	Active residues in 4.5 Å region in half-cystine	BF	rHpy
Active cystines in hydrolases							
4ZA3	206(A)–189(A)	Coil-beta ^b	High-high	8.4	C206	0.882	0.559
2QTV	358(B)–323(B)	Turn-helix ^c	High-high	11.4	C358	0.883	0.439
2JJB	539(C)–533(C)	coil-bend	Low-medium	19.4 C539, P534, A544, C541	0.894	0.465	
1G66	52(A)–46(A)	Helix-coil	Low-medium	17.1 T13, G47, Q49, S50, Q91	0.949	0.43	
1G66	179(A)–147	Bend-coil	Low-low	13.6 D175, T146, D172, A173,	0.985	0.427	
1G66	46(A)–52(A)	Coil-Helix	Medium-low	17.1 T13, G47, Q49, S50, Q91, S174, Y177	1	0.464	
1GPI	225(A)–245(A)	Beta-Beta	High-high	16.3	G207	0.994	0.472
Cystines in microenvironment of active site residues in Hydrolases							
2DIZ	342(A)–323(A)	Coil-beta	Medium-low	11.4	Y340, H343	0.783	0.445
4YEO	127(A)–6(A)	Coil-helix	High-high	3.8	R125	0.812	0.514
3WMT	297(B)–308(B)	Coil-coil	High-high	8.9	L296	0.82	0.408
3E2V	303(B)–331(B)	Helix-coil	High-high	13	E332	0.821	0.447
3E2V	303(A)–331(A)	Helix-coil	High-high	12	E332	0.827	0.518
1XKG	183(A)–145(A)	Coil-helix	High-high	8.5	R184	0.833	0.536
3WMT	297(A)–308(A)	Coil-bend	High-high	8.2	L296	0.835	0.432
2X5X	36(A)–85(A)	Bend-turn	Medium-medium	12	S35	0.84	0.419
300D	43(A)–47(A)	Coil-helix	High-high	16.8	N42	0.851	0.421
2QTV	323(B)–358(B)	Helix-turn	High-high	11.4	C358	0.853	0.489
2XXL	349(B)–314(A)	Turn-helix	High-high	14.7	T348	0.862	0.517
5AR6	64(A)–71(A)	Coil-beta	High-high	17	N70	0.879	0.451
3VPL	159(A)–189(A)	Turn-helix	High-medium	15.7	Y158	0.891	0.409
2JJB	539(B)–539(B)	Coil-coil	Medium-low	24.6	P534, A544, C540	0.904	0.681
1ROR	16(I)–35(I)	Helix-helix	High-high	7.7	F37	0.934	0.498
3WMT	308(A)–297(A)	Bend-coil	High-high	8.2	L296	0.944	0.526
3WMT	308(B)–297(B)	Coil-coil	High-high	8.9	L296	0.946	0.494
3WMT	308(B)–297(B)	Coil-coil	High-high	8.9	L296	0.946	0.494
1KNM	76(A)–59(A)	Coil-Beta	High-high	14.9	W77	0.948	0.527
3B7E	318(B)–336(B)	Coil-bend	High-high	23.4	D387	0.949	0.519
3B7E	318(A)–336(A)	Coil-bend	High-high	22.3	D387	0.95	0.538
2XXL	314(B)–349(A)	Helix-turn	High-high	14.7	T348, V347	0.951	0.505
3MWQ	197(A)–204(A)	Coil-beta	NA ^d -NA ^d	14.8	D253	0.954	0.439
3TRS	18(B)–101(B)	Coil-coil	High-high	15.6	G15	0.954	0.408
2X5X	85(A)–36(A)	Turn-bend	Medium-medium	12	D84	0.958	0.434
3LUM	277(D)–250(A)	Turn-turn	High-high	2.9	Q262, A263	0.965	0.419
2UWA	218(B)–226(B)	Beta-coil	High-low	9.8	T219	0.976	0.524
2D1Z	382(A)–365(A)	Coil-beta	Medium-medium	14.1	E357, R359	0.977	0.548
1LLF	60(A)–97(A)	Coil-coil	High-high	4.5	R361	0.977	0.423
3NKQ	73(A)–86(A)	Coil-coil	High-medium	7.3	N53	0.978	0.487
3NKQ	73(A)–86(A)	Coil-coil	High-medium	7.3	N53	0.978	0.487
1KLI	91(L)–102(L)	Turn-beta	High-high	16.7	E94, S89	0.979	0.481
2UWA	218(C)–226(C)	Beta-coil	High-low	7.2	T219	0.979	0.526
2UWA	218(A)–226(A)	Beta-coil	High-low	8.0	T219	0.982	0.539
2JJB	533(A)–539(A)	Bend-coil	Medium-low	21.6	P534, A544, C539	0.983	0.54
2JJB	533(D)–539(D)	Bend-coil	Medium-low	23.6	P534, A544, C541	0.983	0.54
3B8Z	342(A)–394(A)	Helix-beta	High-high	23.3	C394	0.983	0.413
2ODP	655(A)–685(A)	Coil-turn	High-high	7.5	R694	0.984	0.407
4D04	49(A)–42(A)	Bend-turn	High-high	10.6	C42, I40	0.986	0.553
3PMS	231(A)–252(A)	Helix-coil	High-high	6.4	P246	0.986	0.447
4O36	65(B)–72(B)	Coil-beta	High-high	14.6	Q69, N71, C72	0.986	0.432
4D04	49(B)–42(B)	Bend-turn	High-high	11.4	C42, I40	0.99	0.544
3PMS	208(A)–204(A)	Bend-beta	High-high	15	Y161	0.997	0.452
2GMN	181(B)–201(B)	Coil-coil	High-high	29.7	H101, H177	0.998	0.489
2GMN	181(A)–201(A)	Coil-coil	High-high	29.8	H101, H177	0.999	0.493
3WVC	111(A)–99(A)	Turn-helix	High-high	14.2	S66	1	0.498
4UZ1	413(A)–432(A)	Helix-beta	High-high	16.1	R409, H412	1	0.503
3EQN	698(A)–692(A)	Bend-helix	High-high	7.5	F684	1	0.414
3EQN	692(B)–692(B)	Helix-helix	High-high	7.9	F684	1	0.414
4BDX	33(A)–5(A)	Beta-beta	NA ^d -NA ^d	6.2	L4	1	0.476
3LZT	127(A)–6(A)	Coil-helix	high-High	5.8	R128	1	0.402
Cystine in the microenvironment of Ligase							

Table VII

(Continued)

PDB ID	Cystine (chain)	2° structures	Sequence conservations ^a	Strain energy (KJ/mol)	Active residues in 4.5 Å region in half-cystine	BF	rHpy
2PHN	248(B)–244(B)	Helix-helix	High-medium	12.8	C244	0.889	0.501
2PHN	248(A)–244(B)	Helix-helix	High-medium	12.8	C244	0.895	0.474
Cystine in the microenvironment of Llyases							
1Y7W	221(A)–31(A)	Coil-helix	High-high	11.1	L216	1	0.566
1Y7W	221(B)–31(B)	Coil-helix	High-high	11.4	L216	1	0.596
Cystine in the microenvironment of Transferases							
5AJO	473(A)–456(A)	Coil-beta	NA ^d -NA ^d	12.4	Q451	0.804	0.43
4WMA	356(A)–385(A)	Coil-turn	NA ^d -NA ^d	20.3	N384	0.955	0.444
5FOE	414(A)–407(A)	Coil-coil	High-high	9.7	T1045, I1022	0.996	0.525
Cystine in microenvironment of Oxidoreductases							
3NT1	36(B)–47(B)	Turn-beta	Low-medium	10.9	Y55	0.828	0.418

Secondary structures and sequence conservation of each half-cystines were reported along with the strain energy of the cystine disulphide bonds. PDB IDs are arranged according to the increasing values of buried fraction (second last column). Amino acids and their positions involved in enzyme active sites are mentioned in third last column.

^aSequence conservation obtained from PdbSum.³⁸

^bIncludes beta sheet, beta bridge and beta strand secondary structures calculated by DSSP program.^{27,28}

^cIncludes 3(10)-helix, alpha-helix and π -helix secondary structures calculated by DSSP program.^{27,28}

^dSequence conservation is not available by ConSurf server.³⁶

Exposed-hydrophilic microenvironment cluster hosts half-cystines as a part of enzyme active sites or catalytic sites

Physico-chemical properties (in terms of buried fraction and rHpy values) of this microenvironment cluster are most dissimilar with respect to the embedded cystine residue. Average buried fraction and rHpy values for this cluster are 0.328 and 0.720 respectively (Table I), in contrast to 0.91 and 0.22 for current cystine microenvironment dataset. As this microenvironment cluster is extremely mismatched to the overall hydrophobicity of cystine, very less data points were recorded in this cluster, compared to other two clusters (Table I). There were only 31 half-cystines recorded as part of enzymes, 28 out of those were hydrolases (Table III). Out of these 28, only 5 half cystines were detected as a part of the microenvironment of active site in hydrolases (Table VIII). No half-cystines were reported as part of the active sites in

hydrolases, in contrary to those in buried hydrophilic cluster. This presumably indicates that half-cystines occupying the exposed surface of the protein rarely participate in direct enzymatic reactions, however, those are engaged in protecting (via microenvironment) the enzyme active sites. All these half-cystines are highly scattered in the buried fraction, rHpy space (Fig. 5 and Table VIII).

CONCLUSION

It was already known that similar folds lead to similar functions (enzyme activities) in proteins.^{41–43} In this study we have shown that cystines from different enzymes, evolved within similar microenvironments, when present at the active site of same enzyme class. Our underlying aim was to test the hypothesis that cystines with similar functions (enzyme activities) from

Table VIII

Half-Cystines (First Out of the Pair of Half-Cystines from a Disulphide Shown in the Table) Present in Embedded Microenvironment of Active Sites in Hydrolase Enzyme Class, Reported from Exposed-Hydrophilic Cluster

PDB ID	cystine (chain)	2° structures	Sequence conservations ^a	Strain energy (KJ/mol)	Active residues in 4.5 Å region in half-cystine	BF	rHpy
1ZGX	96(B)–7(B)	Coil-coil	High-low	11.4	K94	0.206	0.821
2G58	96(A)–84(A)	Helix ^b -helix	High-high	10.8	K74	0.31	0.699
2VB1	6(A)–127(A)	Helix-helix	High-high	5.1	E7, I124	0.367	0.719
3EDH	65(A)–64(A)	Coil-coil	High-high	13	C64	0.438	0.602
3RLG	53(A)–201(A)	Turn-turn	High-high	14.4	N200	0.447	0.652

Secondary structures and sequence conservation of each half-cystines were reported along with the strain energy of the cystine disulphide bond. PDB IDs are arranged according to the increasing values of buried fraction (second last column). Amino acids and their positions involved in enzyme active sites are mentioned in third last column.

^aSequence conservation obtained from PdbSum.³⁸

^bIncludes 3(10)-helix, alpha-helix and π -helix secondary structures calculated by DSSP program.^{27,28}

different proteins will belong to similar microenvironment clusters. To this end, by using hierarchical clustering method, we have identified three different microenvironment clusters: I) buried-hydrophobic, ii) buried-hydrophilic and exposed-hydrophilic, and correlated these with their enzymatic functions. In our analysis, special emphasis has been given to cystines from enzyme classes. As demonstrated here, cystines from -C-x-x-C- motifs in Oxidoreductase enzyme class all have very similar microenvironment, that is, buried and hydrophobic. The catalytic cystines from the hydrolase enzyme class always prefer partly exposed hydrophilic microenvironment (that is buried hydrophilic cluster). Other cystines from hydrolase enzymes which participate in stabilizing catalytic or active sites were detected in both buried hydrophilic and exposed hydrophilic microenvironment clusters. Despite of low to medium sequence conservation in some of the cystines, active cystines from hydrolase enzymes share similar microenvironments. This report illustrates that cystine residues share similar microenvironments at active sites of specific enzyme classes despite of variation in their sequence similarities and sequence position conservations, thus validating the working hypothesis. We believe this conclusion should be further verified for other amino acids, particularly, titratable amino acids, like Aspartic acid, Glutamic acid, Arginine and so forth. Titratable amino acids are expected to be more sensitive toward change in microenvironment due to alteration in their protonation states. Hence, microenvironment modulated switching of protonation states in titratable amino acids would be of interest in major biochemical reactions, like photosynthesis. For example, carbon dioxide fixing enzyme, Ribulose-1,5-bisphosphate carboxylase oxygenase (RuBisCo), involves seven charged residues in its active site. It is known that switching some of these protonation states could lower the transition state, thus assist to prevent backward reaction and trap more carbon dioxide.⁴⁴ This can be further verified by modifying the protein structures with altered protonation states of charged residues and test the capacity of carbon dioxide fixation.

Amino acids in heterogeneous protein microenvironments are analogous to amino acids in different solvents with variable dielectric media. As solubility, bond dissociation energy and spectral properties of cystine vary from hydrophilic to hydrophobic solvents, the same is also expected when cystine is transferred from hydrophilic part of the protein microenvironment to its hydrophobic part. This could be exploited to guide experimentation in to the local dielectric medium within protein microenvironments. We have shown here that disulfide-bridged cystine molecule is a good model system to examine the effect of various dielectric medium on S-S bond dissociation energy and can be extended for experimental verifications.

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